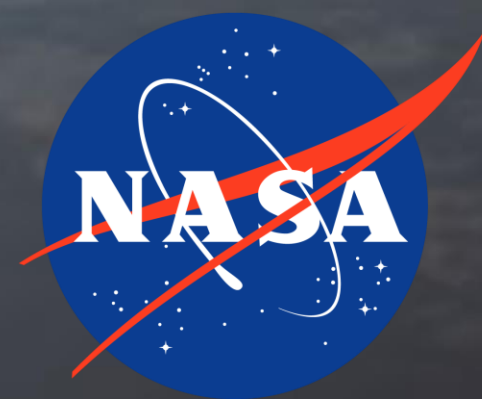


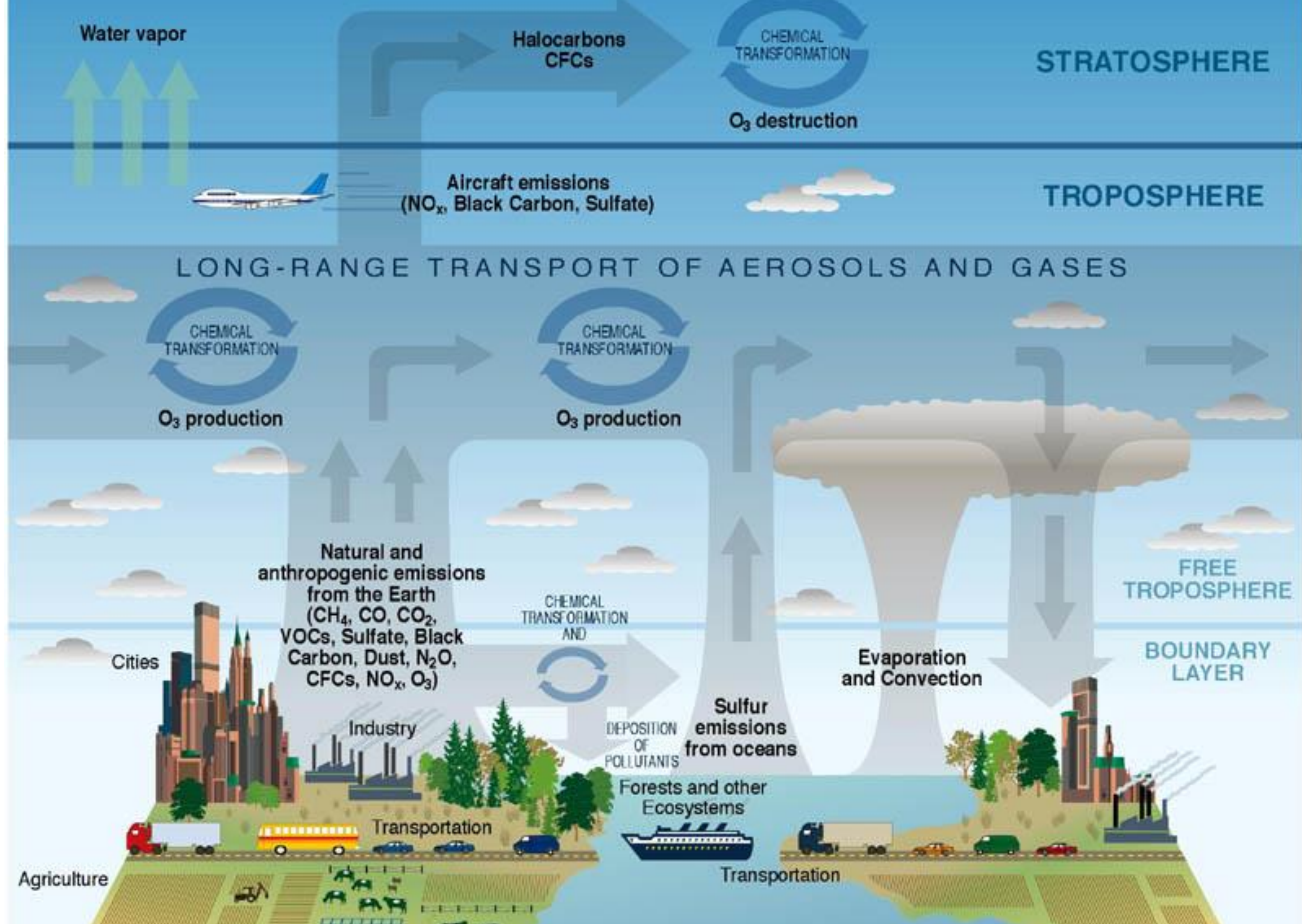
# Atmospheric composition reanalyses - Toward Earth System Reanalysis -

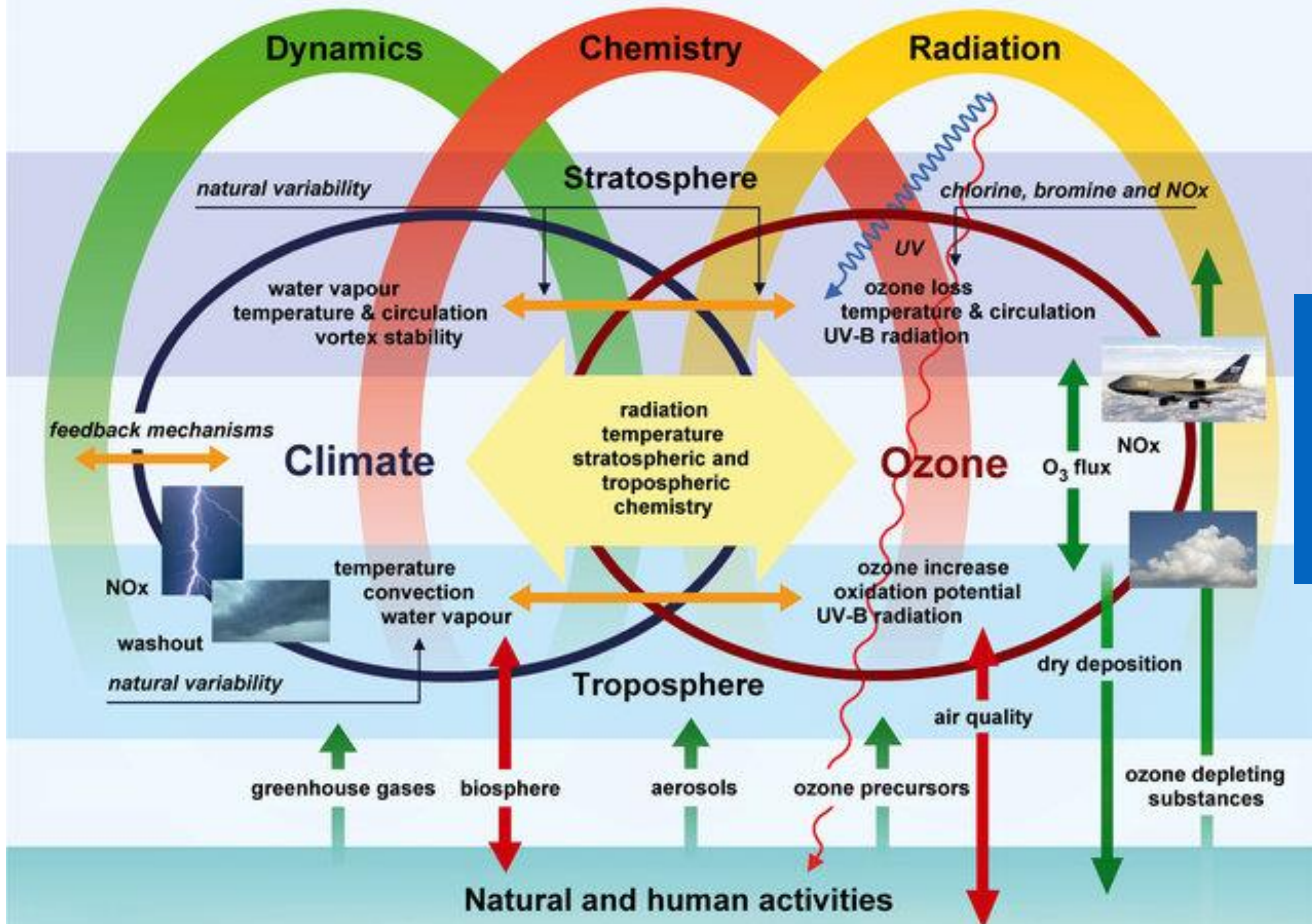
Kazuyuki Miyazaki

NASA Jet Propulsion Laboratory, California Institute of Technology



**Jet Propulsion Laboratory**  
California Institute of Technology

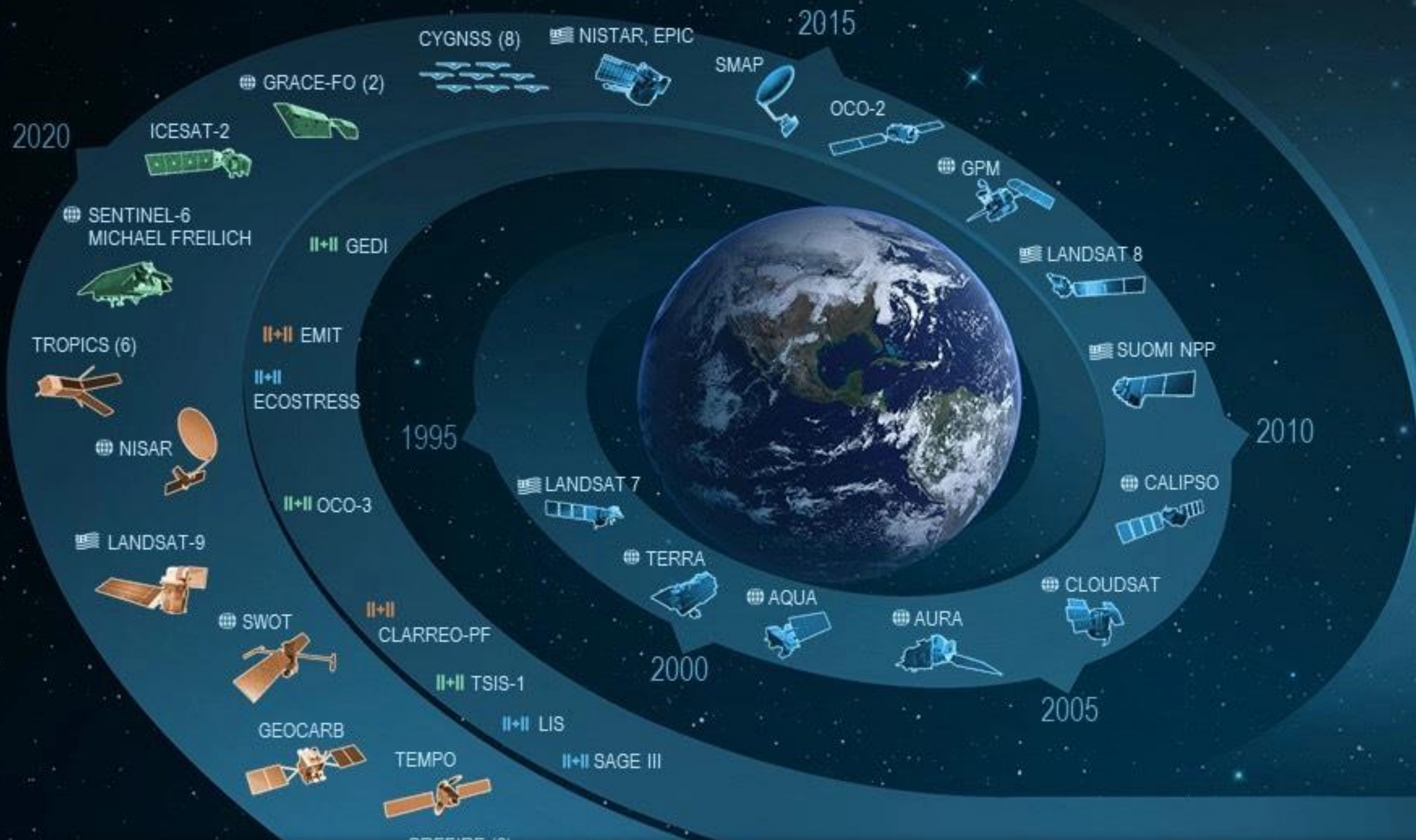




Comprehensive understanding of coupled systems toward *Earth system reanalysis*



# EARTH FLEET



## INVEST/CUBESATS

- TEMPEST-D 2021
- CSIM-FD 2023
- HARP 2022
- CIRIS 2023
- CTIM\* 2022
- HYTI\* 2022
- SNOOPI\* 2022
- NACHOS\* 2022
- NACHOS2\* 2022

## JPSS INSTRUMENTS

- OMPS-LIMB 2022
- LIBERA 2027

### KEY

- INTERNATIONAL
- U.S. PARTNER
- ISS INSTRUMENT
- JPSS INSTRUMENT
- CUBESAT
- LAUNCH

*Atmospheric composition data assimilation*

(1) make best use of all available data from heterogeneous sensors, and  
 (2) produce chemically and dynamically consistent integrated dataset



# Atmospheric composition data assimilation

Atmospheric composition only

Chemical transport model (CTM)

Coupled with NWP

Coupled chemistry meteorology models (CCMM)

**FORECASTS**

**MODELS**

**INPUT**

Meteorological fields

**NWP**

Weather Data Analysis and Assimilation

Concentration & Deposition fields

**CTM**

Land-use, Orography and Other Data on Geographic Features

Anthropogenic & Biogenic Emissions

Strato ozone → Temp & wind  
AOD → Radiation

**Atmospheric composition**

Observations



# Stratospheric ozone in meteorological reanalyses

**Table 1.** Key characteristics of ozone treatment in reanalyses.

Coupled  
with NPW

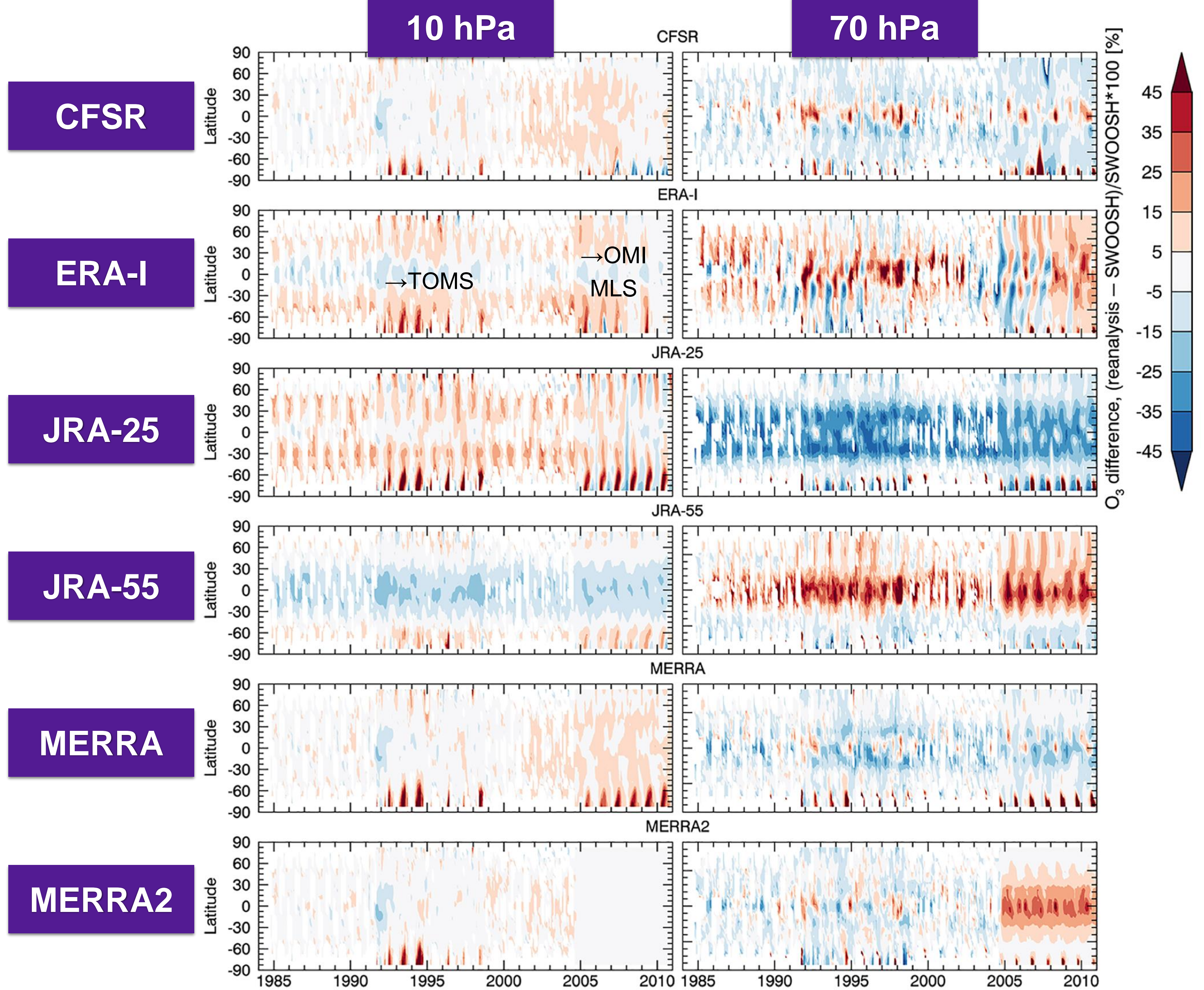
Reanalysis	Primary TCO data sources	Vertical profile data sources	Stratospheric O <sub>3</sub> used in radiative transfer	Stratospheric O <sub>3</sub> treatment	Photochemical parameterization
NCEP R1	None	None	Climatology	None	None
NCEP R2	None	None	Climatology	None	None
CFSR	SBUV	SBUV	Analyzed	Prognostic	CHEM2D-OPP
ERA-40	TOMS	SBUV	Climatology	Prognostic	CD86
ERA-I	Same as ERA-40	SBUV, GOME, MLS, MIPAS	Same as ERA-40	Same as ERA-40	Same as ERA-40
JRA-25	TOMS (1979–2004)* OMI (2004–)	Nudging to climatological profile	Daily values from offline CTM	Daily values from offline CTM	Shibata et al. (2005)
JRA-55	Same as JRA-25	None	Daily values from updated offline CTM	Daily values from updated offline CTM	Shibata et al. (2005)
MERRA	SBUV	SBUV	Analyzed	Prognostic	Stajner et al. (2008)
MERRA-2	SBUV (1980–9/2004) OMI (9/2004–)	SBUV, MLS	Same as MERRA	Same as MERRA	Same as MERRA

Davis et al, 2017

*Latitude–time evolution of relative differences between ozone in meteorological reanalyses and the merged SWOOSH ozone record.*

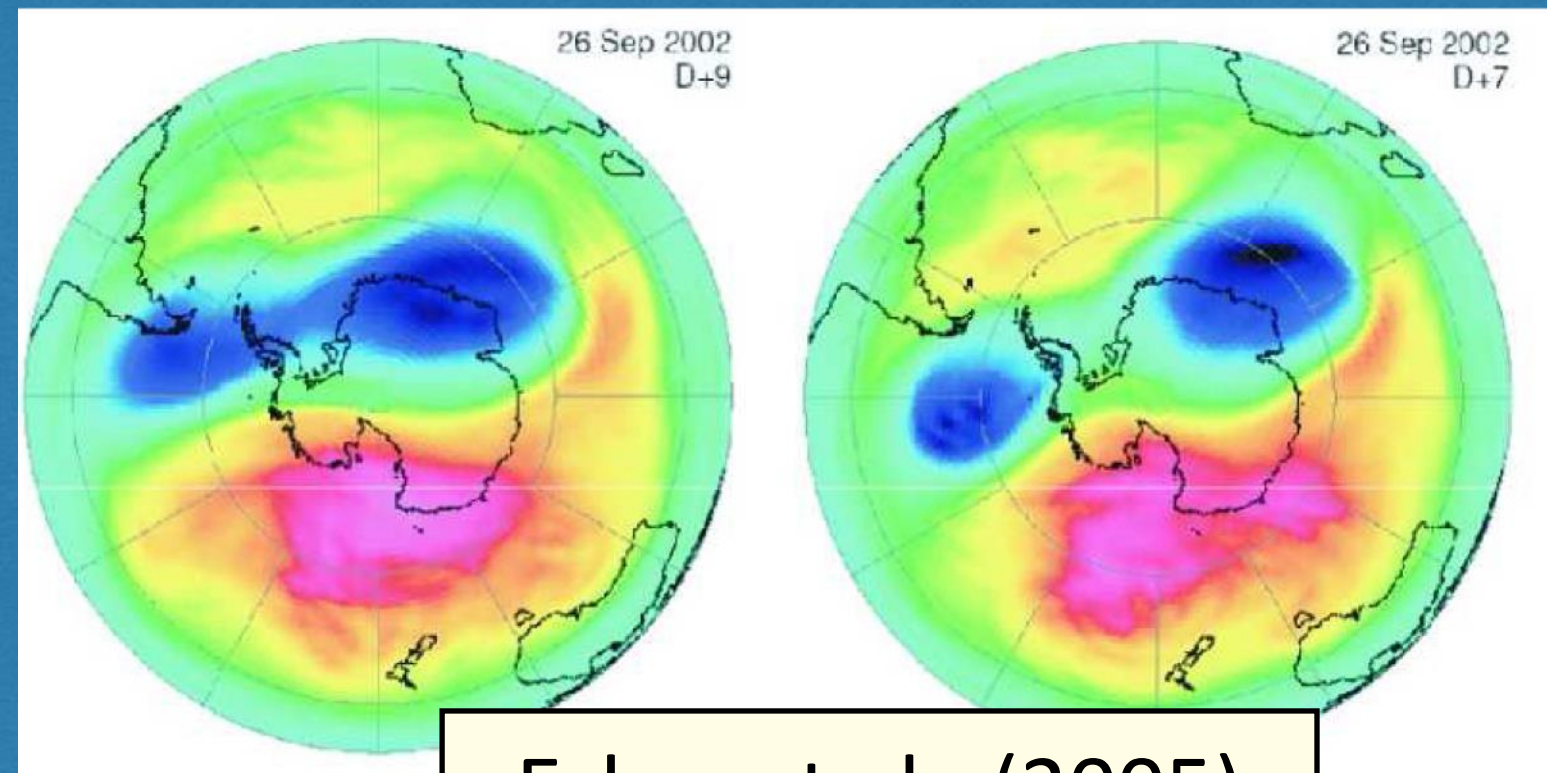
- Relative errors: 10-30 %
- Troposphere: larger errors
- Consistent long-term record is still challenging

Davis et al., 2017



# Middle atmosphere

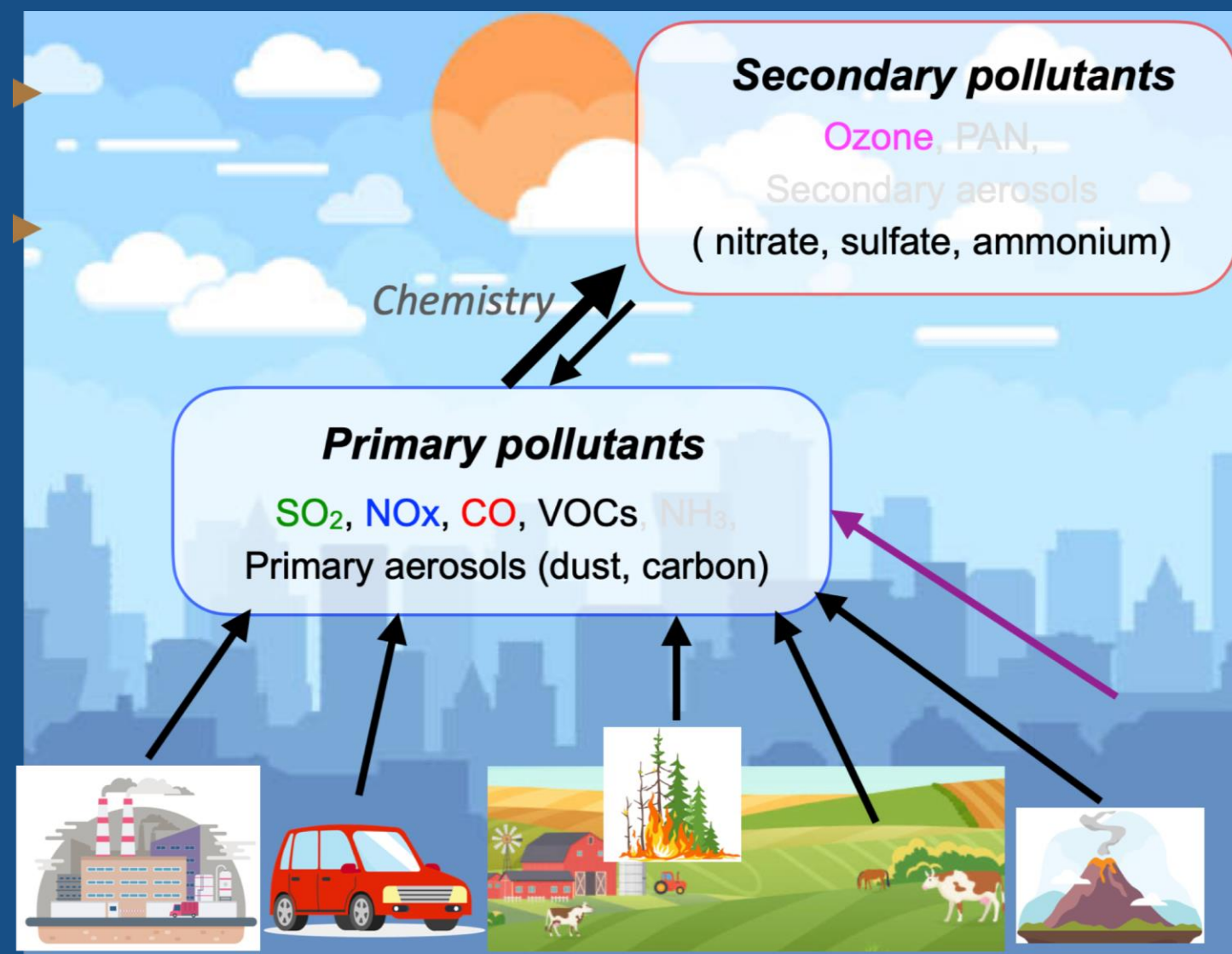
Polavarapu et al. (2005)  
Lahoz et al. (2007)



Eskes et al., (2005)

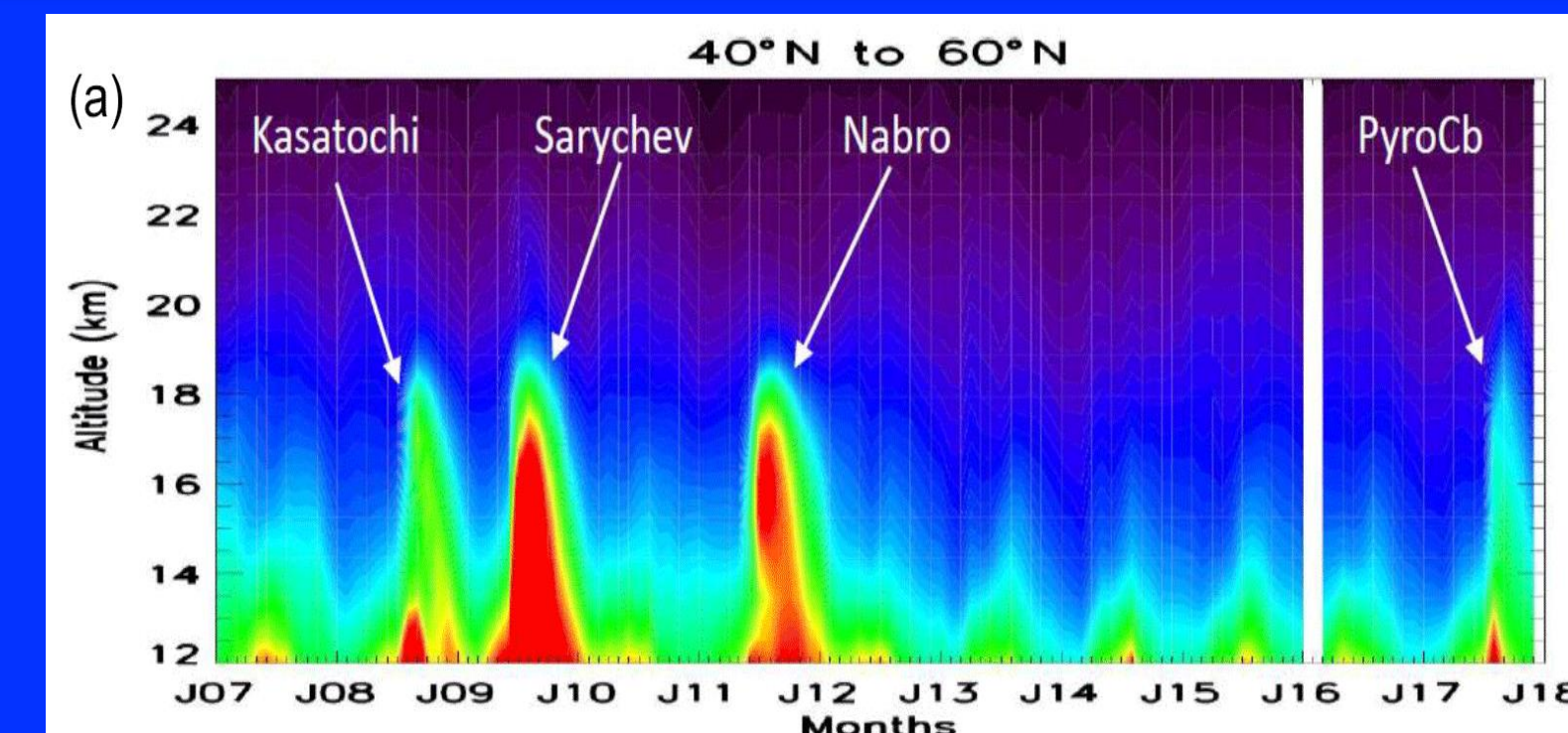
- Ozone hole
- UV monitoring / forecasting
- Radiative forcing
- Middle atmosphere dynamics / chemistry

AC only



- Climate model inputs
- Satellite data validation
- Radiative forcing
- Emission inversion / scenario evaluation
- Air quality monitoring / forecasting
- Extension to non-observed species

Bocquet et al. (2015)



Troposphere:  
Trace gas

Troposphere:  
Aerosols



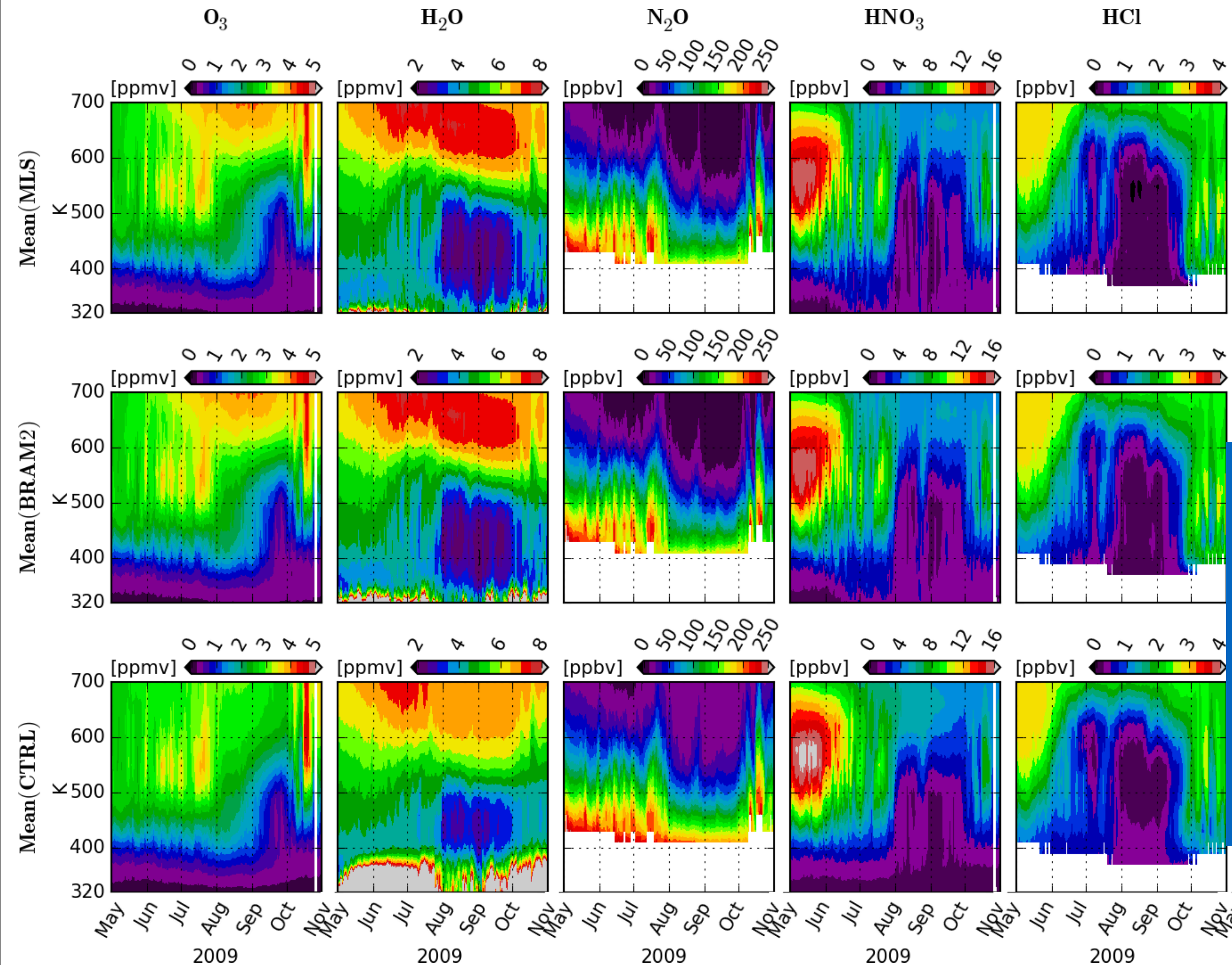


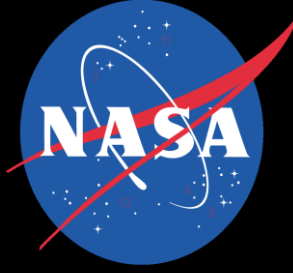
# Chemical reanalysis for the middle atmosphere

## Middle atmosphere

MLS chemical reanalysis using Belgian Assimilation System for Chemical Observations (BASCOE)

Provide baseline information to evaluate  
(1) chemistry-climate models  
(2) bias in independent measurements  
and to inform  
(3) the stratosphere to troposphere influence





# Tropospheric ozone reanalyses considered in IGAC TOAR-2

Assimilated measurements

Reanalysis system	Grid	Resolution	Period	Strato/Column ozone	Tropo ozone	Precursors	Surface	Scheme
IASI-R (E. Emili)	GLOBAL, 0.1-1000 hPa	2° x 2°		MLS	IASI			3D-Var
CAMSRA (A. Inness)	GLOBAL	T255, available at 0.75° x 0.75°	-2003	SBUV, OMI, MLS, GOME2, SCIAMACHY, MIPAS, TROPOMI, OMPS		CO, NO2		4D-Var
RAQMS (B. Pierce)	GLOBAL, 0-60km	1° x 1°		OMI cloud cleared, MLS	OMI cloud cleared	MOPITT CO, OMI NO2		3D-Var
GEOS-C								4D-Var
TCR2 ( )								EnKF
CAQRA (X. Tang)	REGIONAL (CHINA)	15 km x 15 km	-2013			MOPITT CO, OMI NO2	China	EnKF
CMAQ-GSI (R. Kumar)	REGIONAL (US)	12 km x 12 km	2005-2018			MOPITT CO		3D-Var

## IGAC Tropospheric Ozone Assessment Report Phase-2 (TOAR-2)

### Chemical reanalysis WG

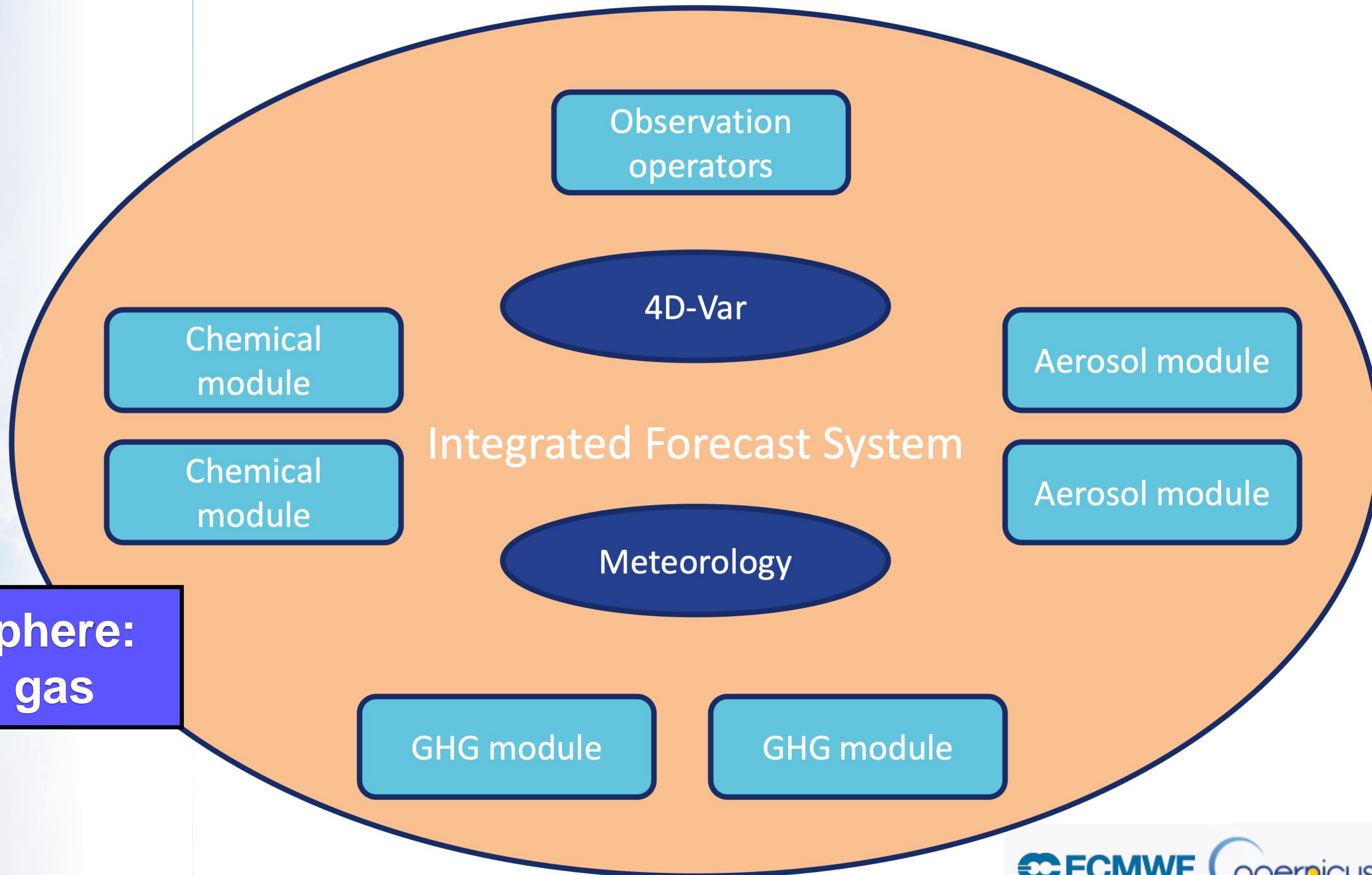
- Do they agree/disagree with each other and with independent observations?
- What is the relative importance of assimilated measurements to improve ozone?

Troposphere: Trace gas



Atmosphere  
Monitoring

# Global system – ECMWF's IFS





Atmos  
Monit

# Near-real-time satellite data usage

Species	Instruments
Global system	
O <sub>3</sub>	<b>OMI, SBUV-2, GOME-2, MLS, TROPOMI, OMPS, IASI</b>
CO	<b>IASI, MOPITT, TROPOMI</b>
NO <sub>2</sub>	<b>OMI, GOME-2, TROPOMI</b>
SO <sub>2</sub>	<b>OMI, GOME-2, TROPOMI, IASI</b>
Aerosol	<b>MODIS, PMAp, VIIRS, SLSTR, SEVIRI</b>
CO <sub>2</sub>	<b>GOSAT, OCO-2</b>
CH <sub>4</sub>	<b>GOSAT, IASI, TROPOMI</b>
GFAS: Fire Radiative Power	<b>MODIS, GOES-E/W*, SEVIRI*, SLSTR, VIIRS, HIMAWARI-8*</b>
<b>Assimilated</b> Monitored Future	

A wide-range of atmospheric composition satellite observations are assimilated in the IFS to produce daily analyses.

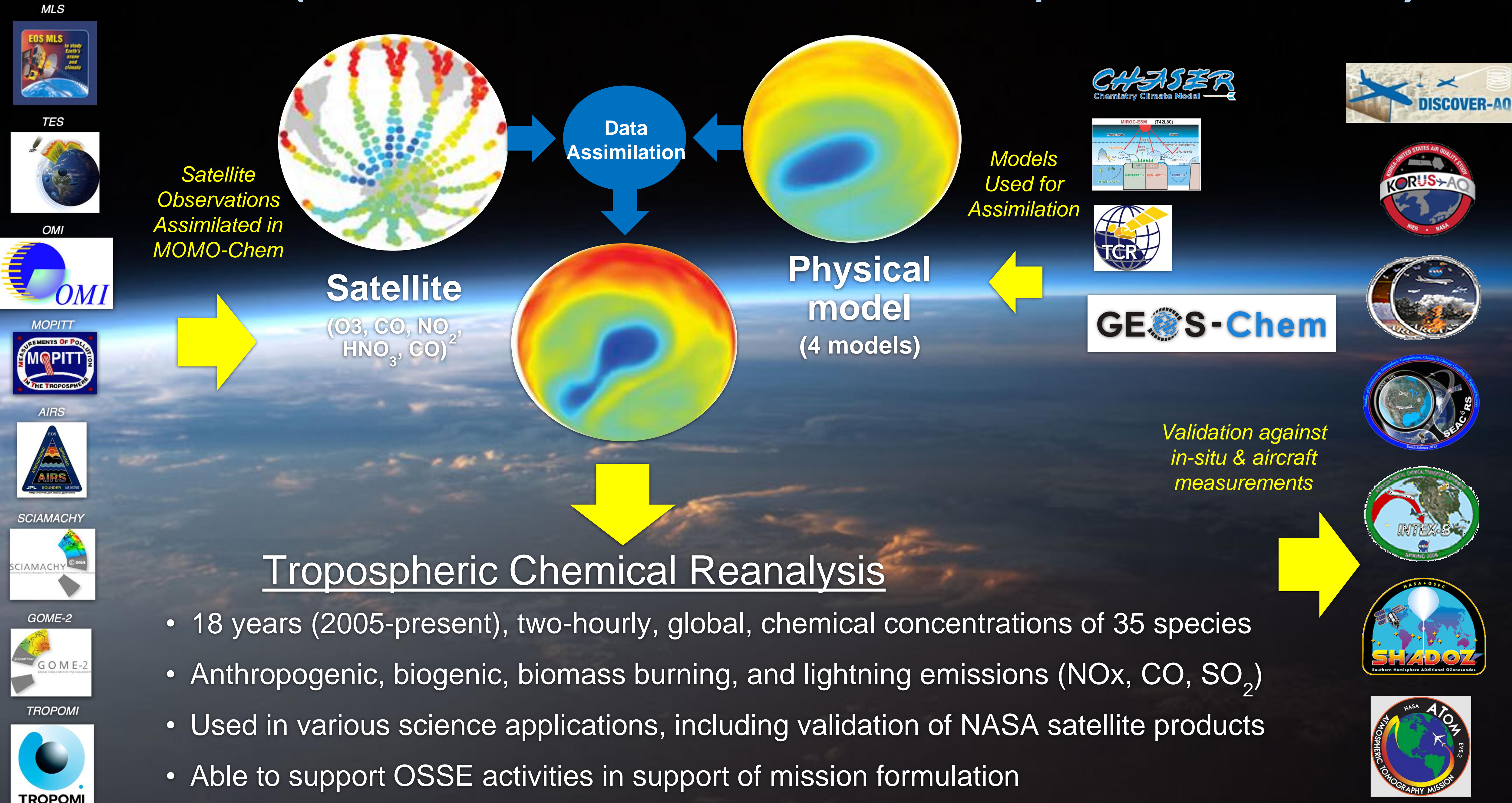
Control runs (with no data assimilated) and forecasts (initialised from analyses) are also produced in CAMS.

CAMS data used for field campaign planning and evaluating special events.

Composition data additional to thousands of assimilated meteorological data.

\*Geostationary platform

# MOMO-Chem (Multi-mOdel Multi-cOnstituent Chemical) Data Assimilation System



- 18 years (2005-present), two-hourly, global, chemical concentrations of 35 species
- Anthropogenic, biogenic, biomass burning, and lightning emissions (NO<sub>x</sub>, CO, SO<sub>2</sub>)
- Used in various science applications, including validation of NASA satellite products
- Able to support OSSE activities in support of mission formulation

**TCR-2**

**MLS**  
( $O_3$ ,  $CO$ ,  $HNO_3$ )

**TES**  
( $O_3$ )

**Secondary pollutants**  
Ozone, PAN,  
Secondary aerosols  
(nitrate, sulfate, ammonium)

**Primary pollutants**  
 $SO_2$ ,  $NO_x$ ,  $CO$ , VOCs,  $NH_3$ ,  
Primary aerosols (dust, carbon)

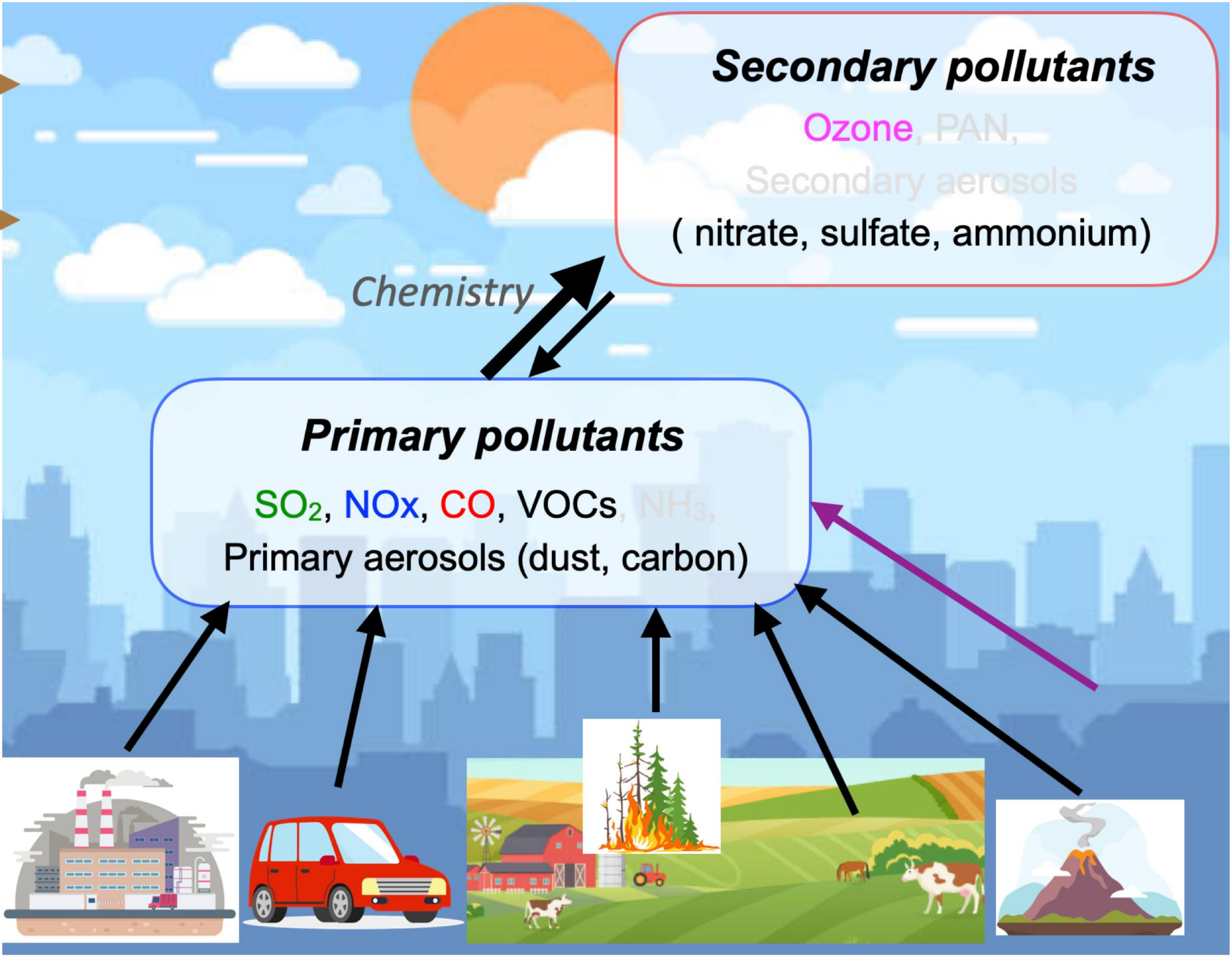


Assimilation

**OMI**  
( $SO_2$ ,  $NO_2$ ,  $CH_2O$ )

**MOPITT** ( $CO$ )

“Decadal Aura era”  
chemical reanalysis



**TCR-3**

**MLS**  
( $O_3$ ,  $CO$ ,  $HNO_3$ )

**TES, AIRS/OMI**  
( $O_3$ )

**Secondary pollutants**  
Ozone, PAN,  
Secondary aerosols  
(nitrate, sulfate, ammonium)

**Primary pollutants**  
 $SO_2$ ,  $NO_x$ ,  $CO$ , VOCs,  $NH_3$ ,  
Primary aerosols (dust, carbon)

**VIIRS**  
(AOD)

**CrIS**  
( $O_3$ , PAN)

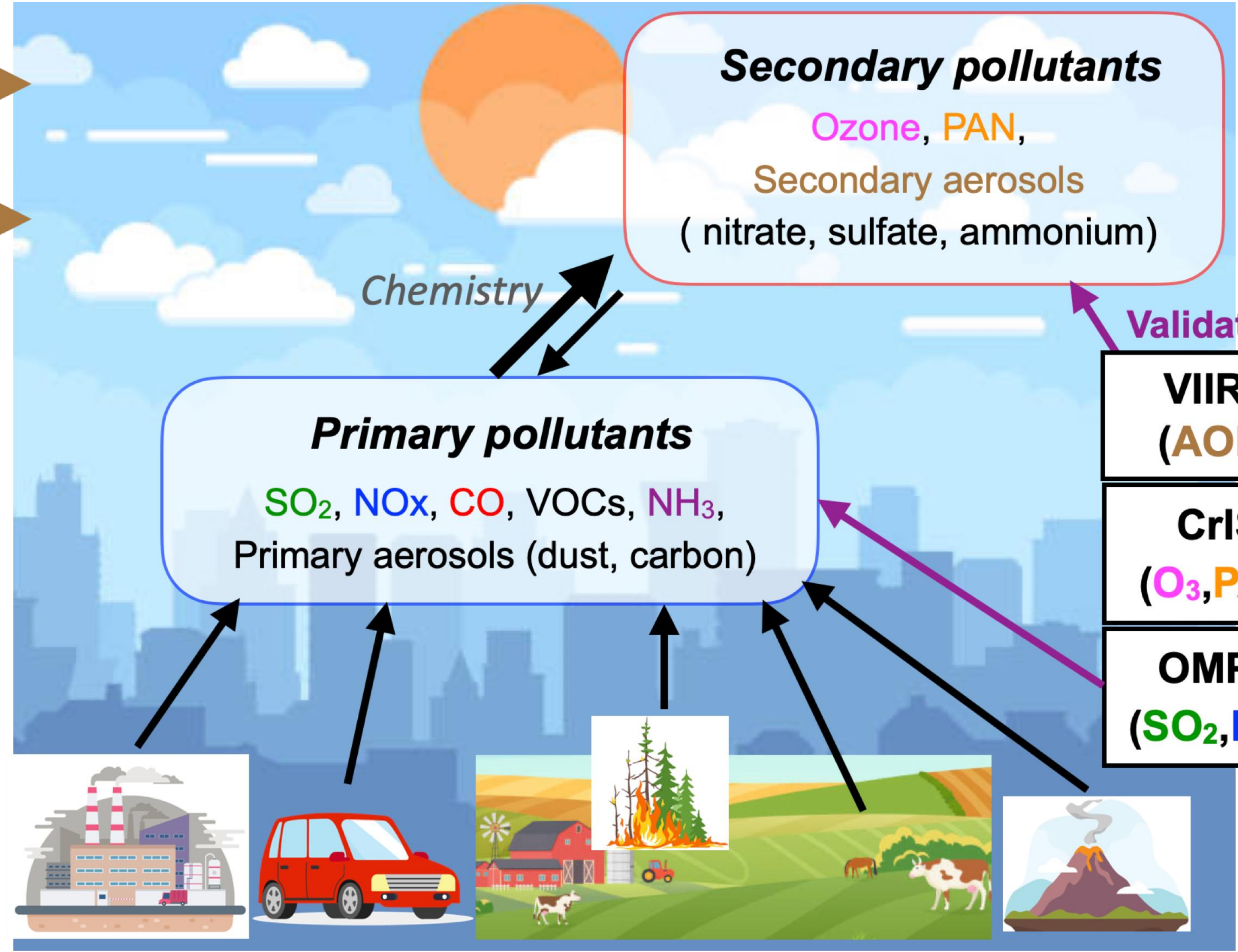
**OMPS**  
( $SO_2$ ,  $NO_2$ )

**Long-lived GHGs**

Oxidation capacity (OH)  
↓  
 $CH_4$

AQ-GHG co-emissions  
↓  
 $CO_2$

“Decadal Aura era”  
“New satellite era”  
chemical reanalysis



**Assimilation**

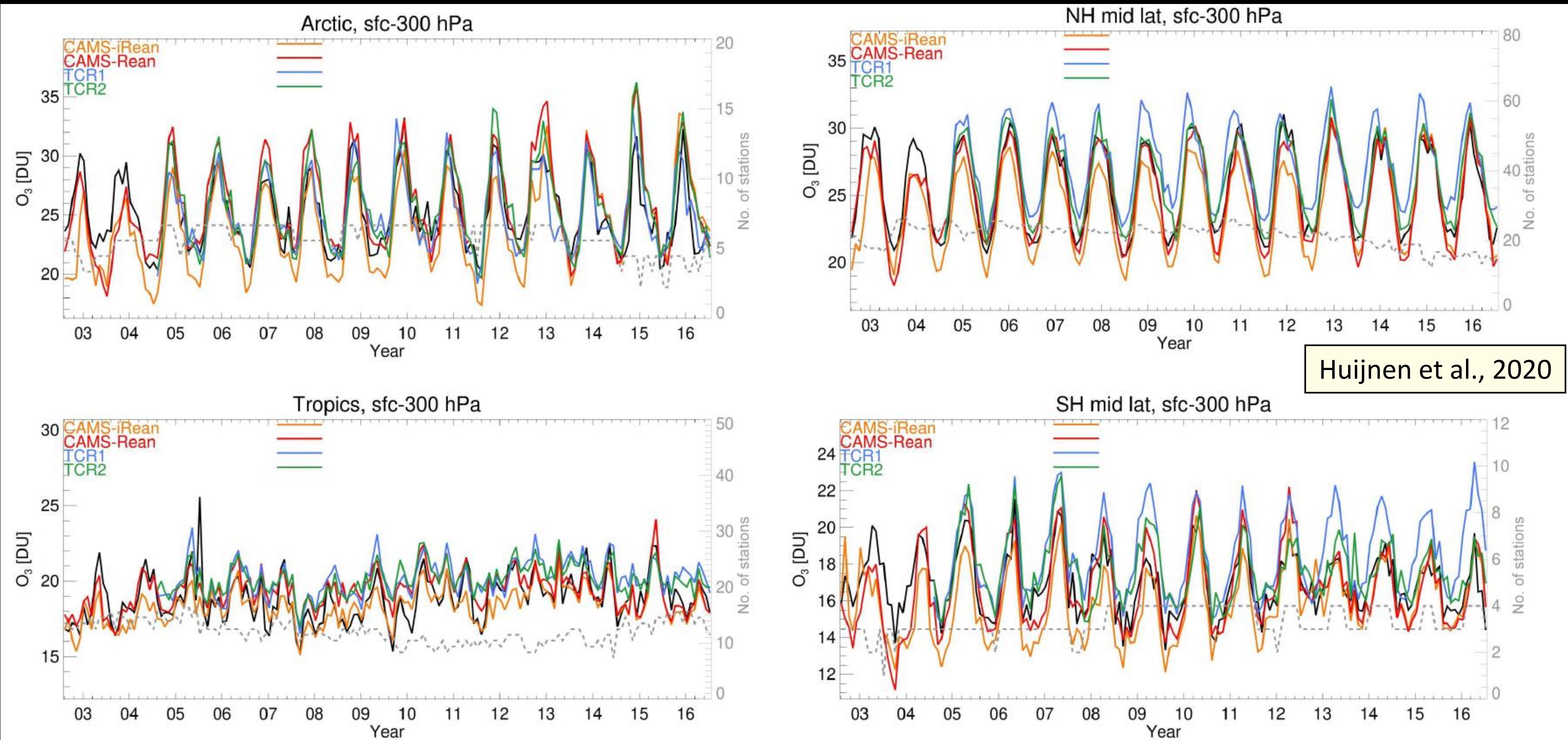
**OMI, TROPOMI** ( $SO_2$ ,  $NO_2$ ,  $CH_2O$ )

**CrIS** ( $NH_3$ )

**MOPITT** ( $CO$ )



# Chemical reanalysis inter-comparisons: CAMS & TCR



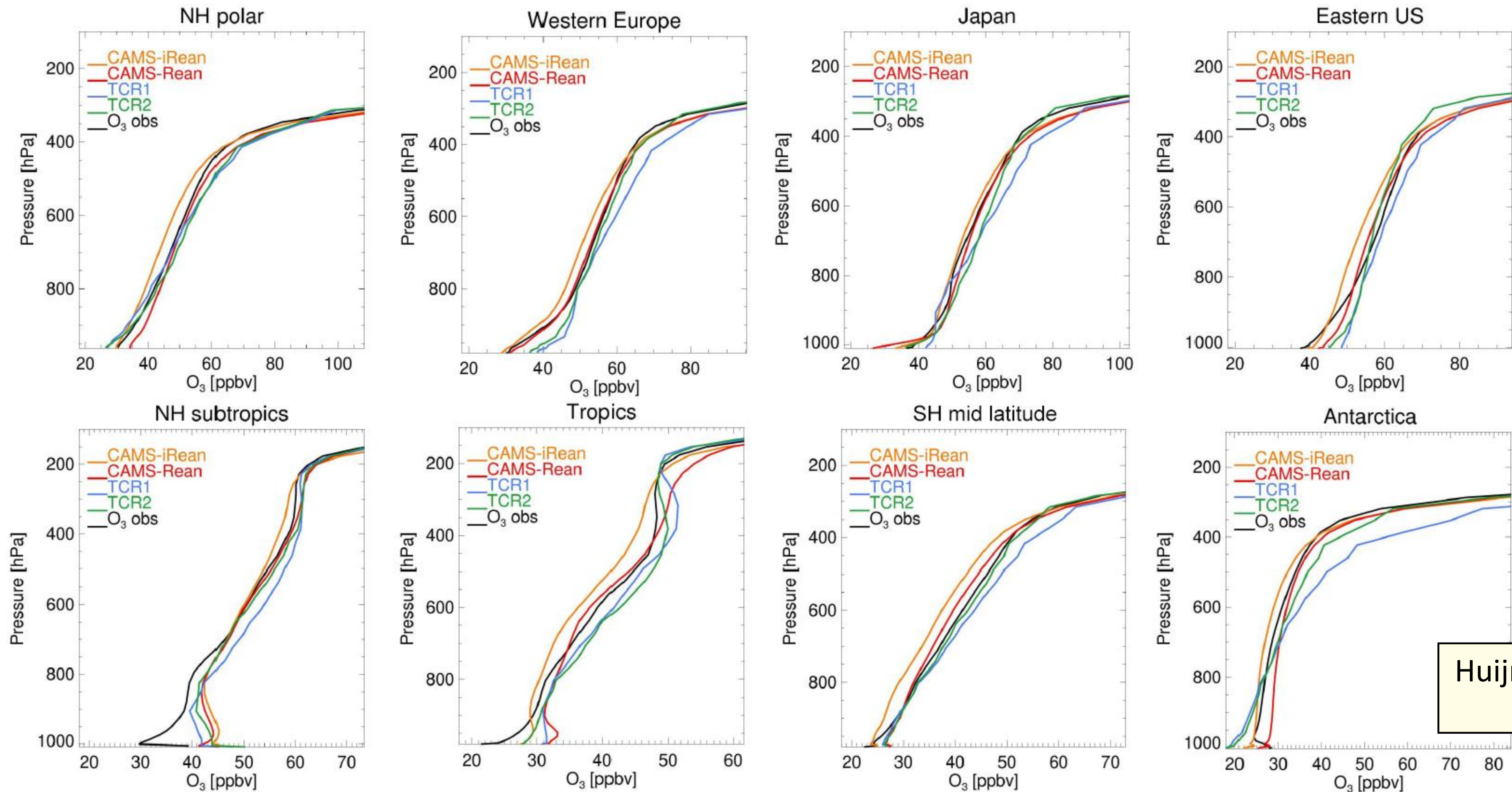
Huijnen et al., 2020

**Improvements in both forecast model and DA led to better agreements with independent obs**





# Chemical reanalysis inter-comparisons: CAMS & TCR



Huijnen et al.  
2020

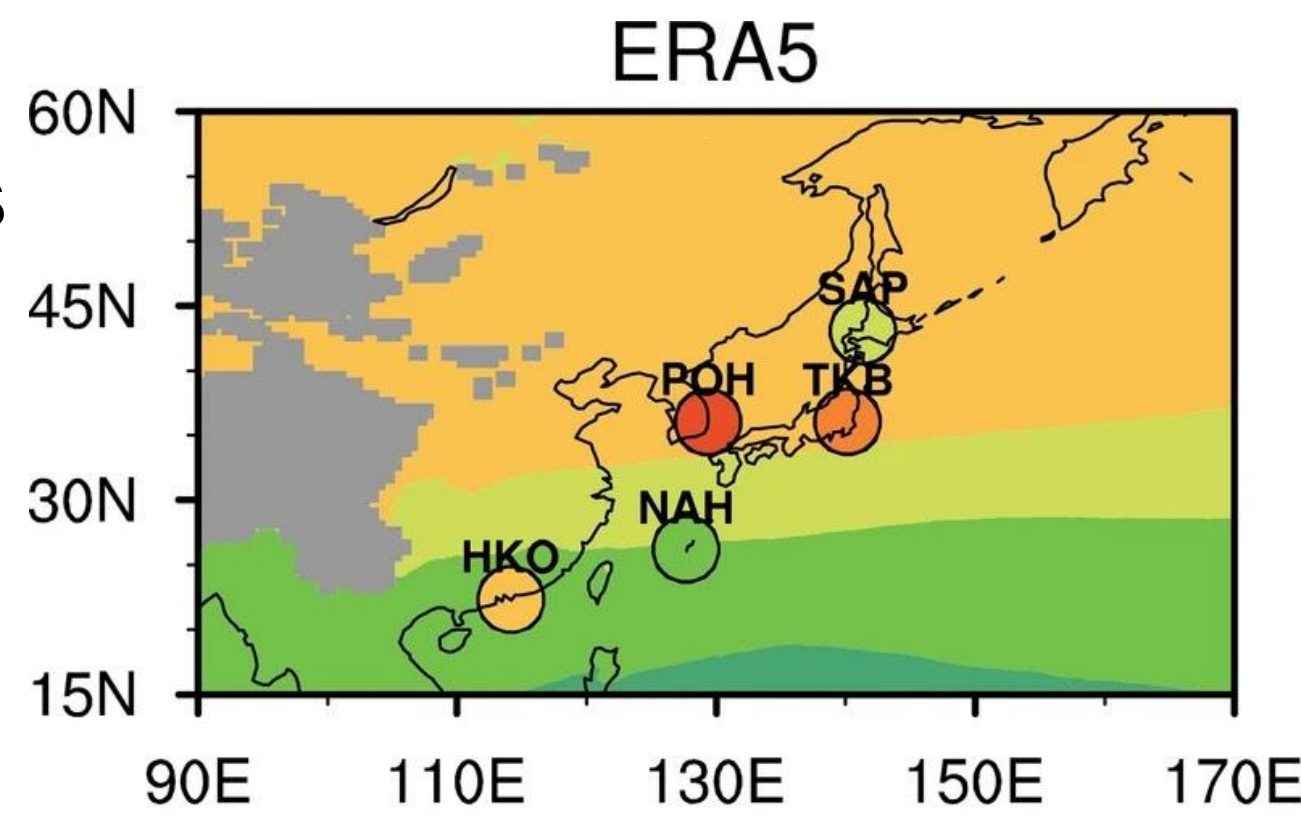
**Remaining errors in the tropics and near the surface**

**Need to improve model performance, incl. spatial resolution, increasing obs, incl. surface obs, and DA**

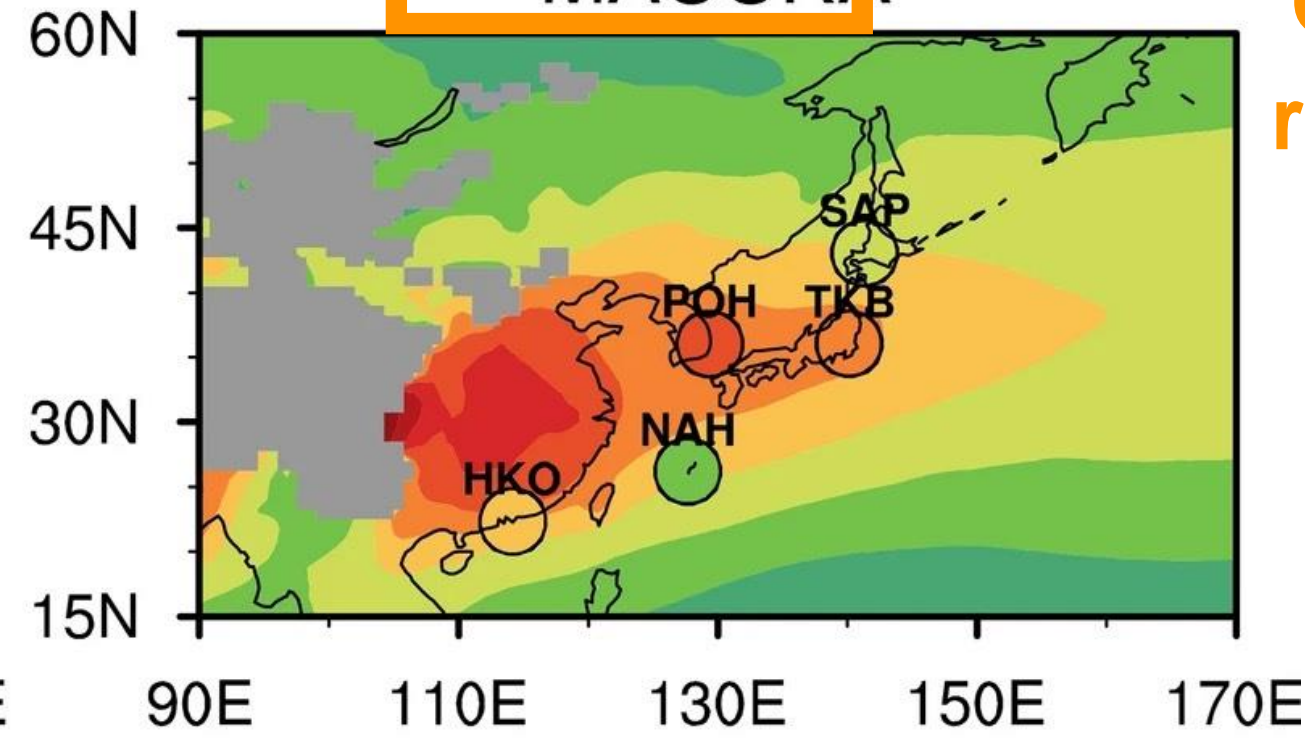


# Ozone reanalysis inter-comparisons

**Met  
reanalysis**



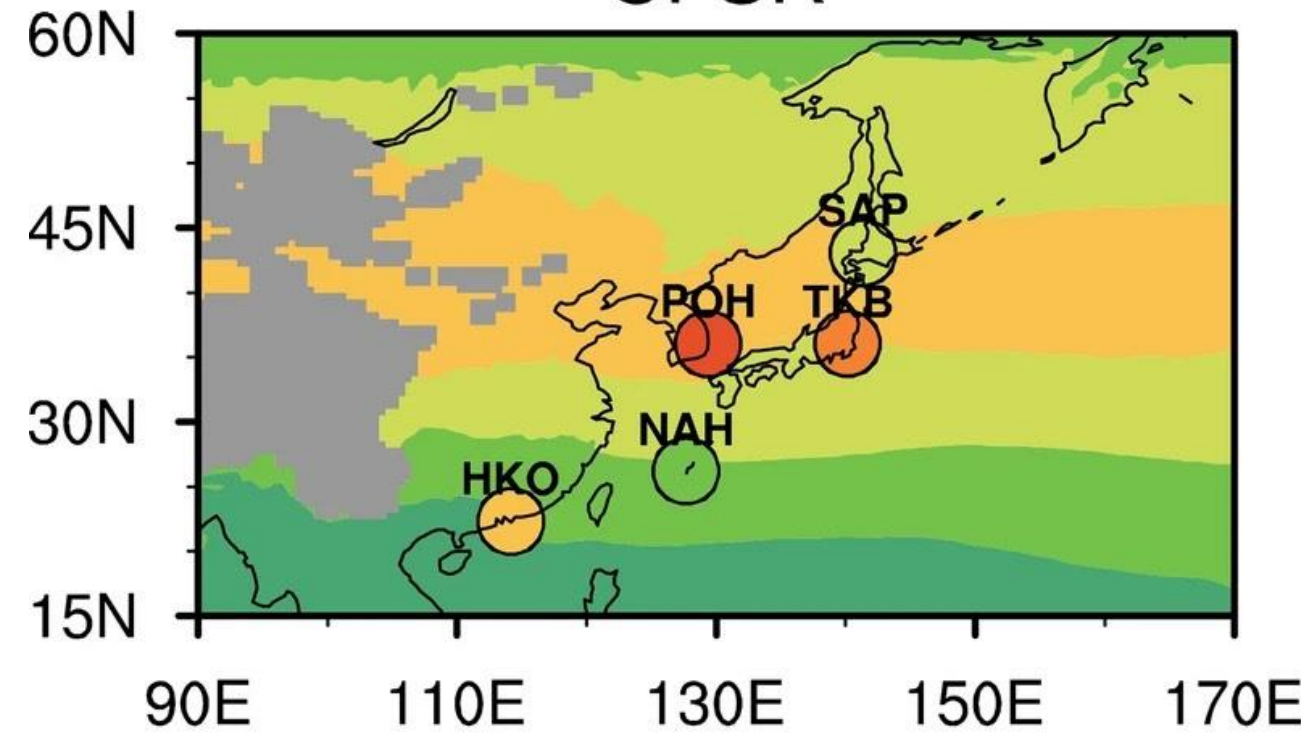
**MACCRA**



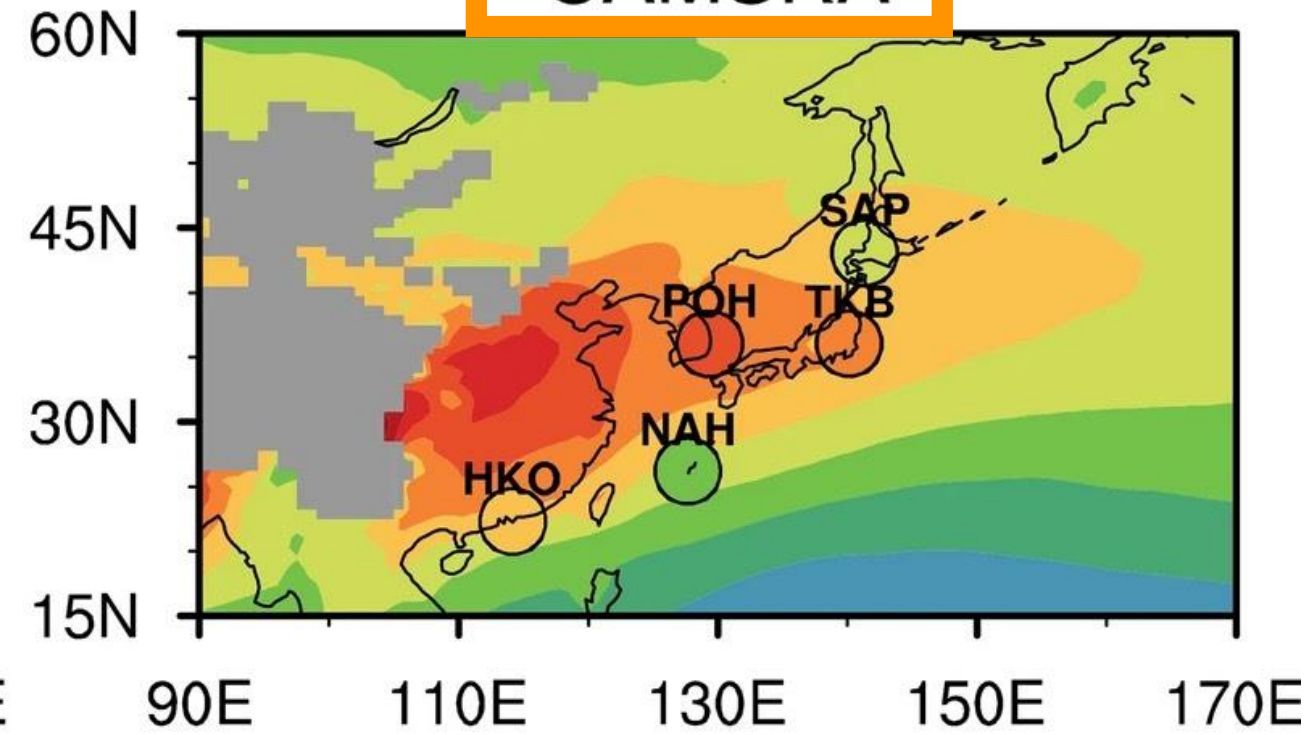
**Chemical  
reanalysis**

*850 hPa ozone over East Asia, validated  
against ozonesonde measurements*

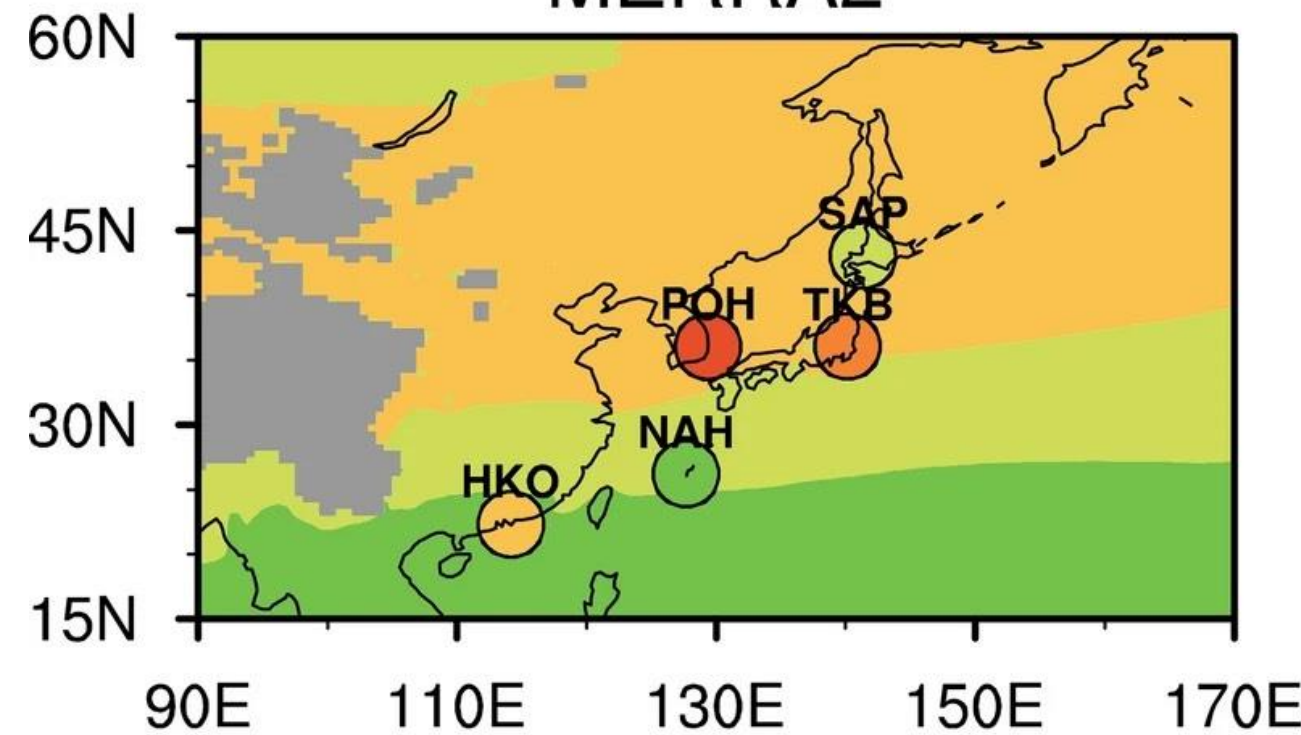
**CFSR**



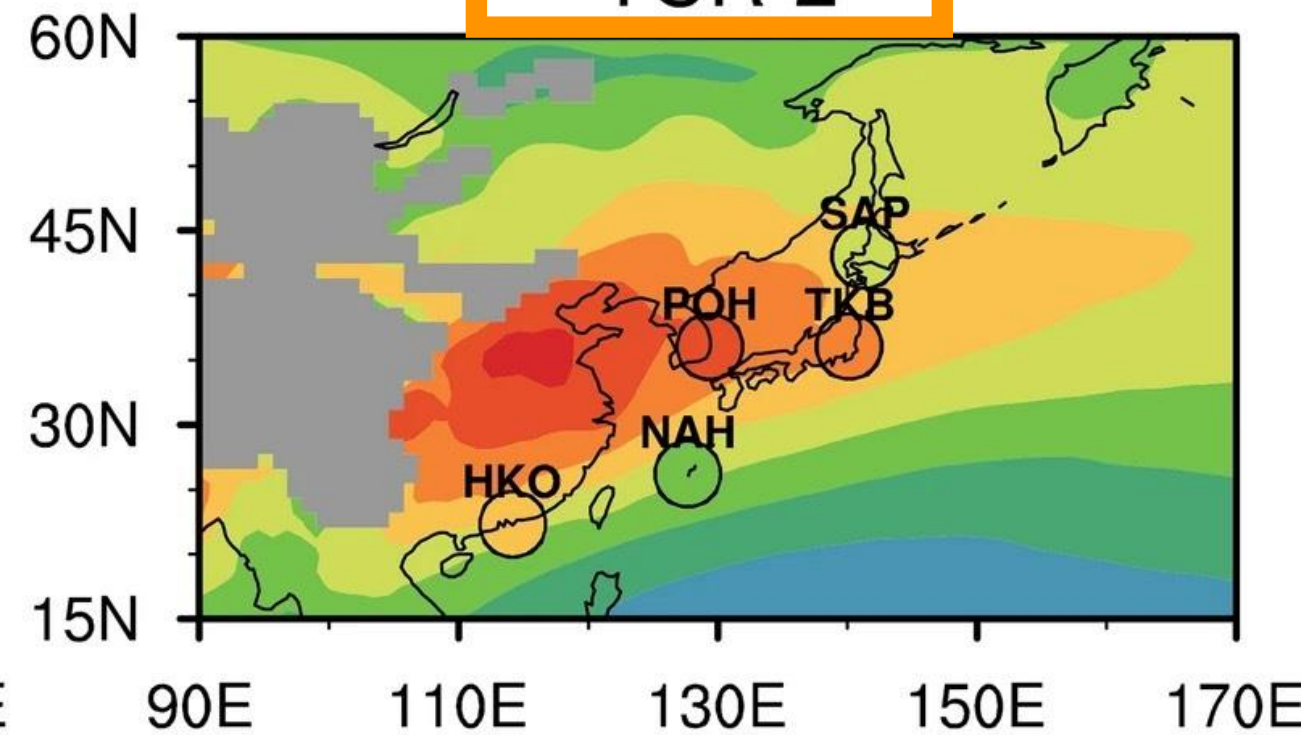
**CAMSRA**



**MERRA2**

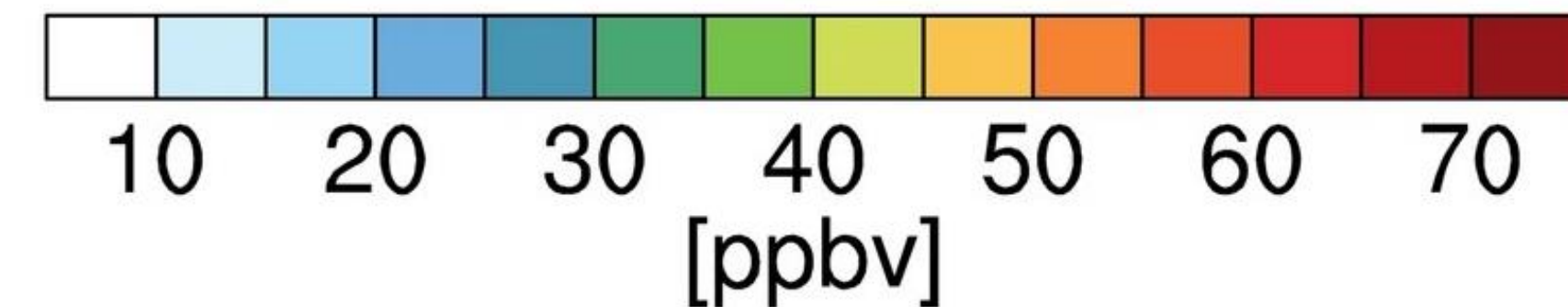


**TCR-2**



- Controlled by emissions, transport from China and Pacific
- The chemical reanalyses are useful for AQ research
- The met reanalyses do not capture the major spatial gradients

Park et al, 2020

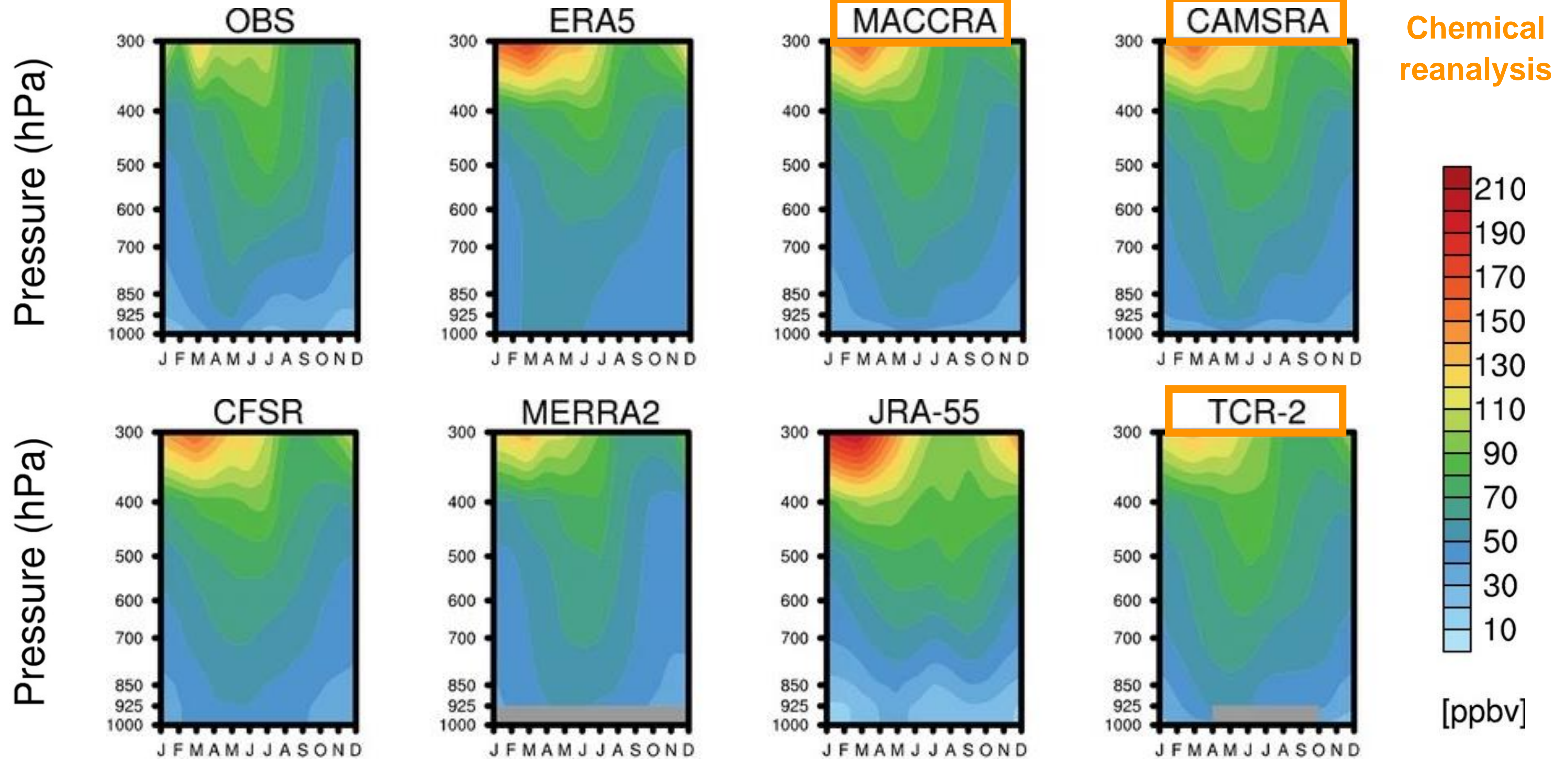




# Ozone reanalysis inter-comparisons

*Seasonal and vertical distribution of ozone over Sapporo, Japan*

Park et al, 2020

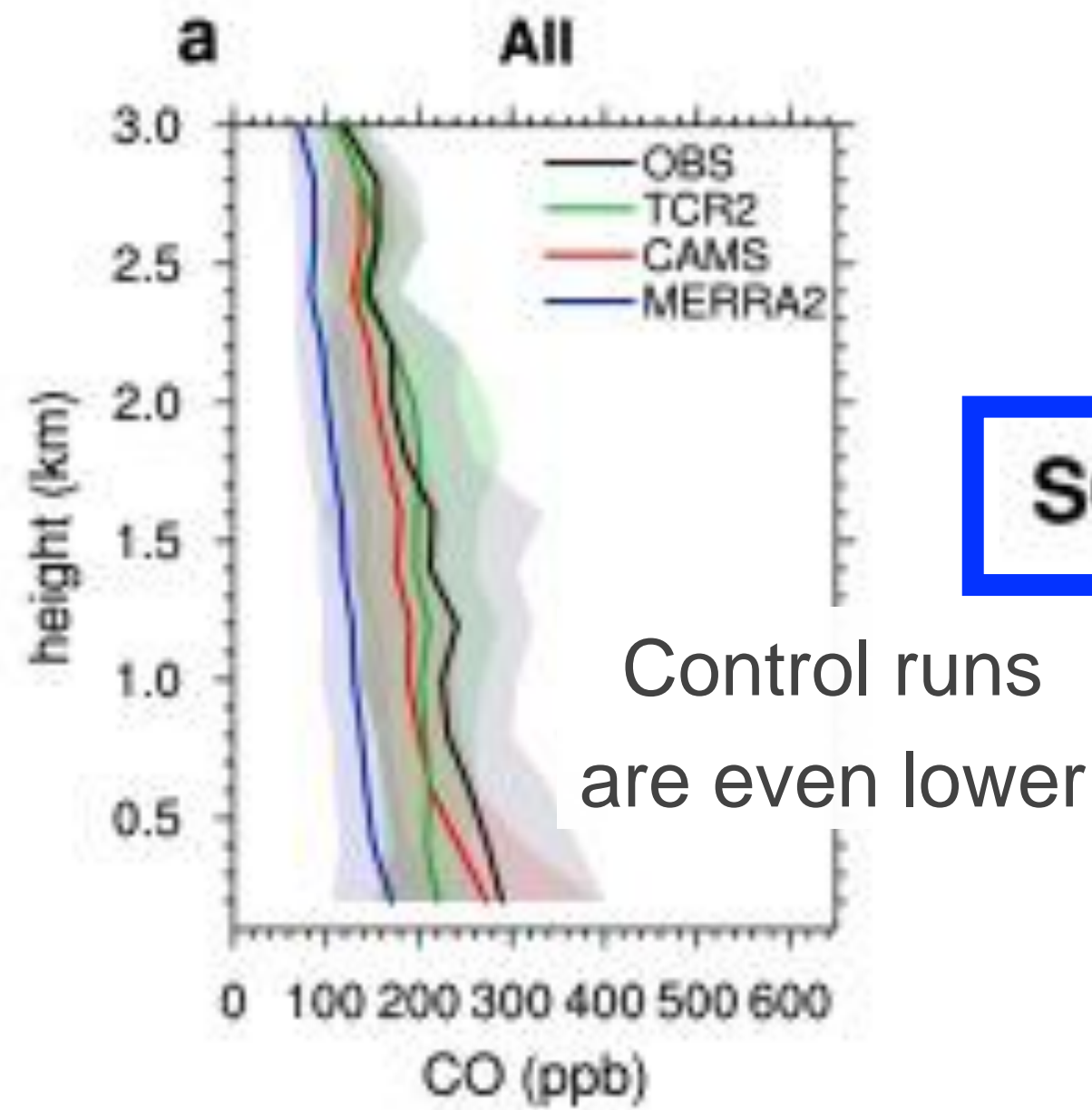


The meteorological reanalysis needs to be improved substantially throughout the troposphere

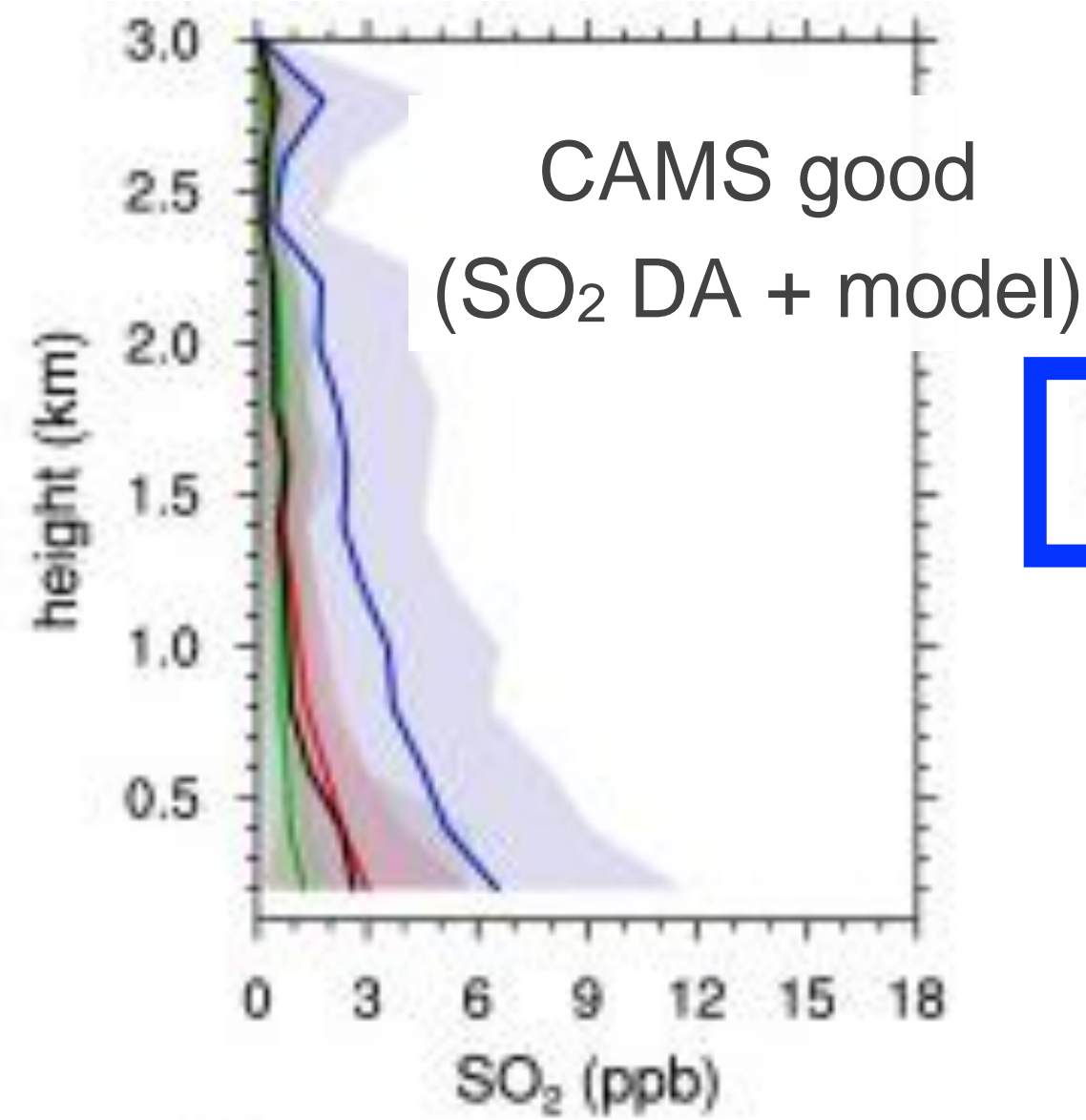


# Chemical reanalysis inter-comparisons: Multi-species

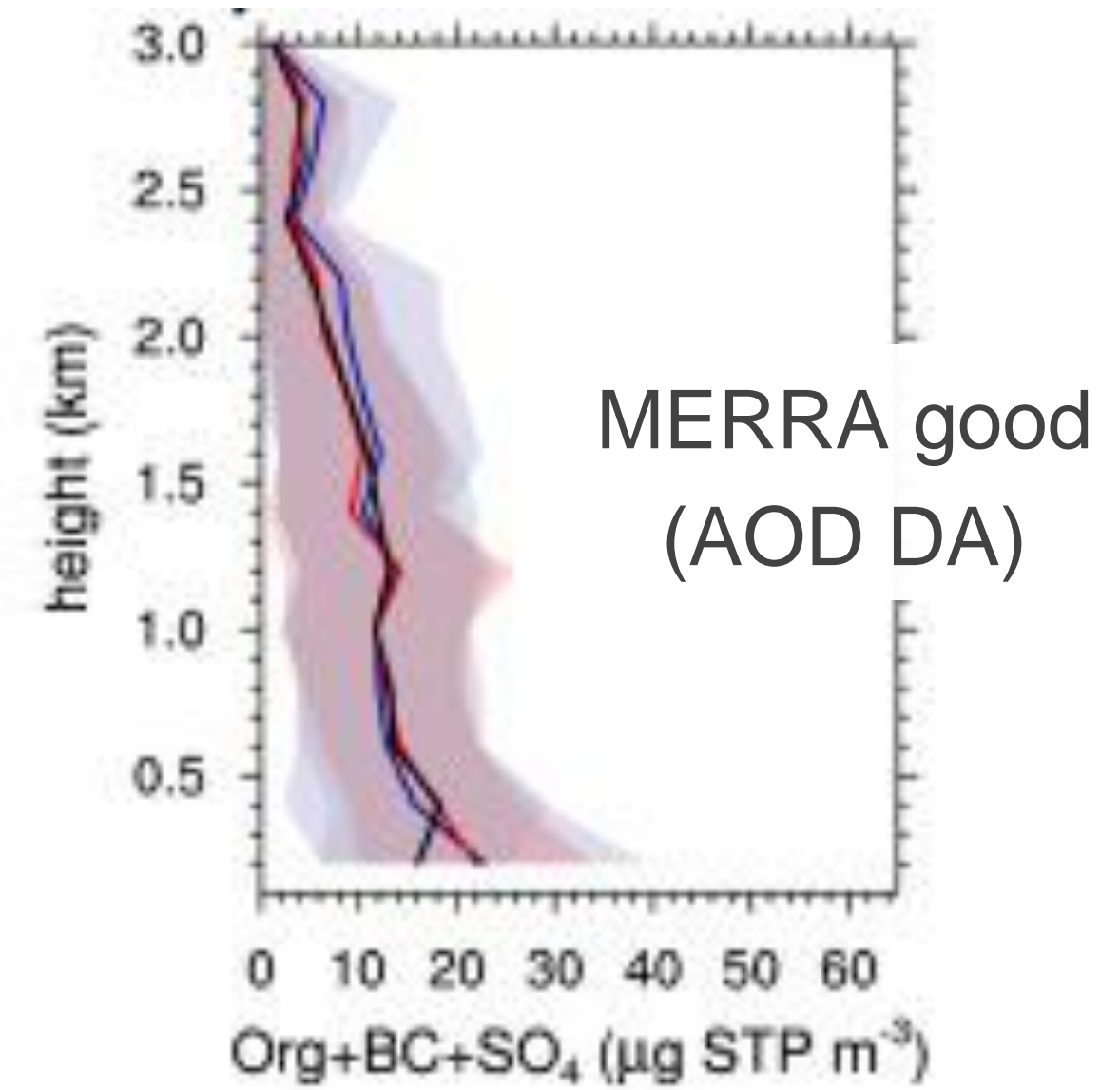
**CO**



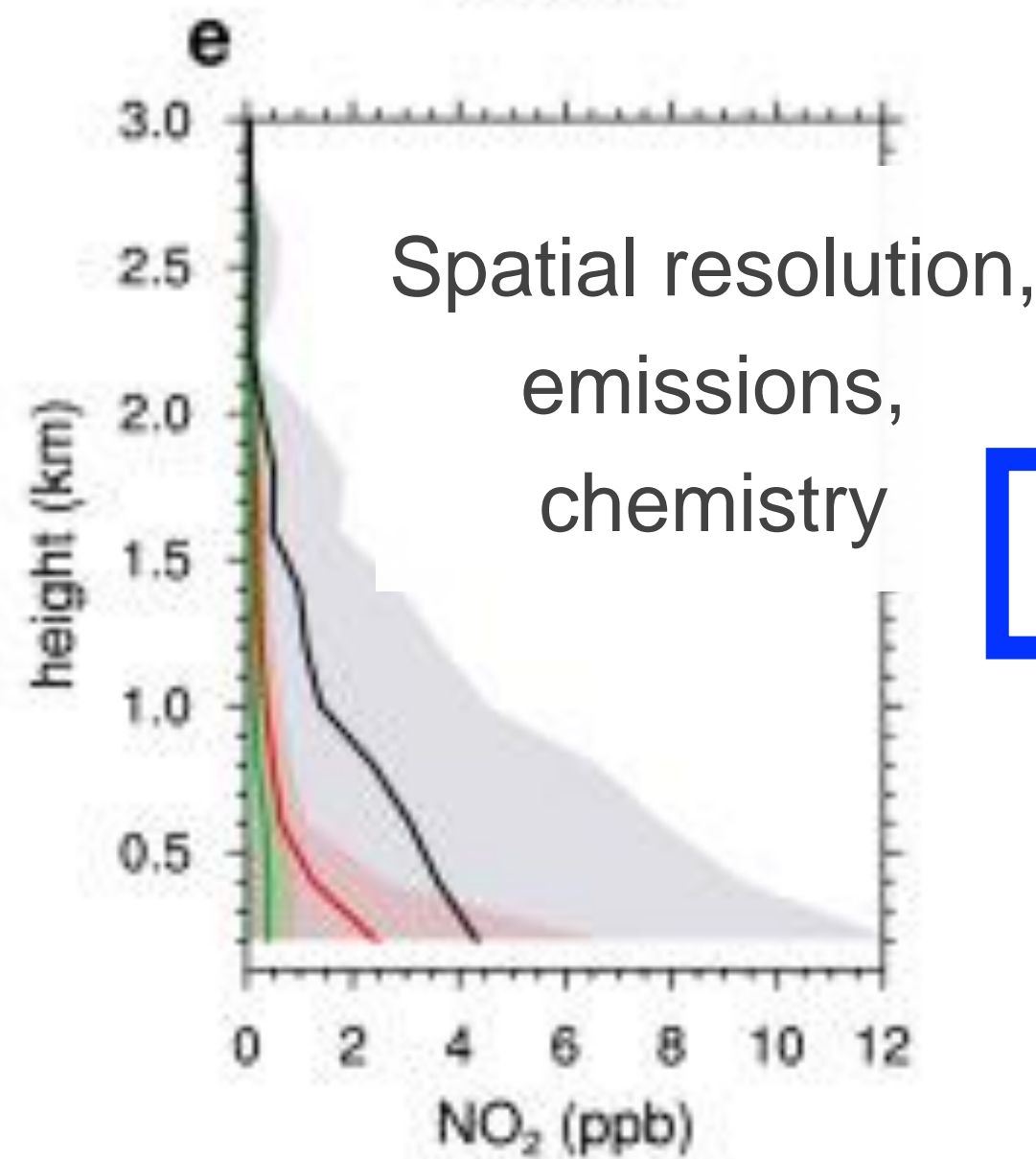
**SO<sub>2</sub>**



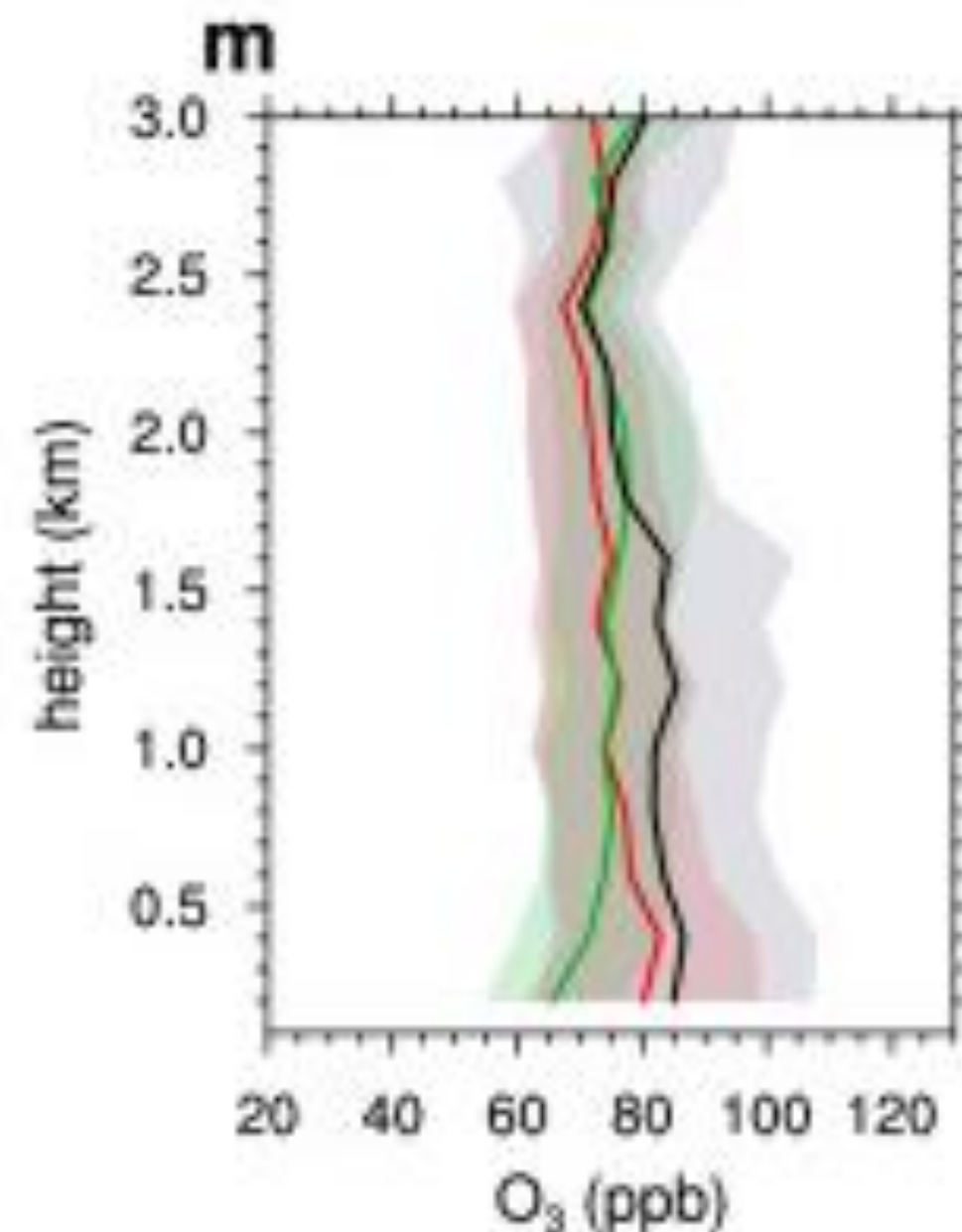
**PM**



**NO<sub>2</sub>**



**O<sub>3</sub>**



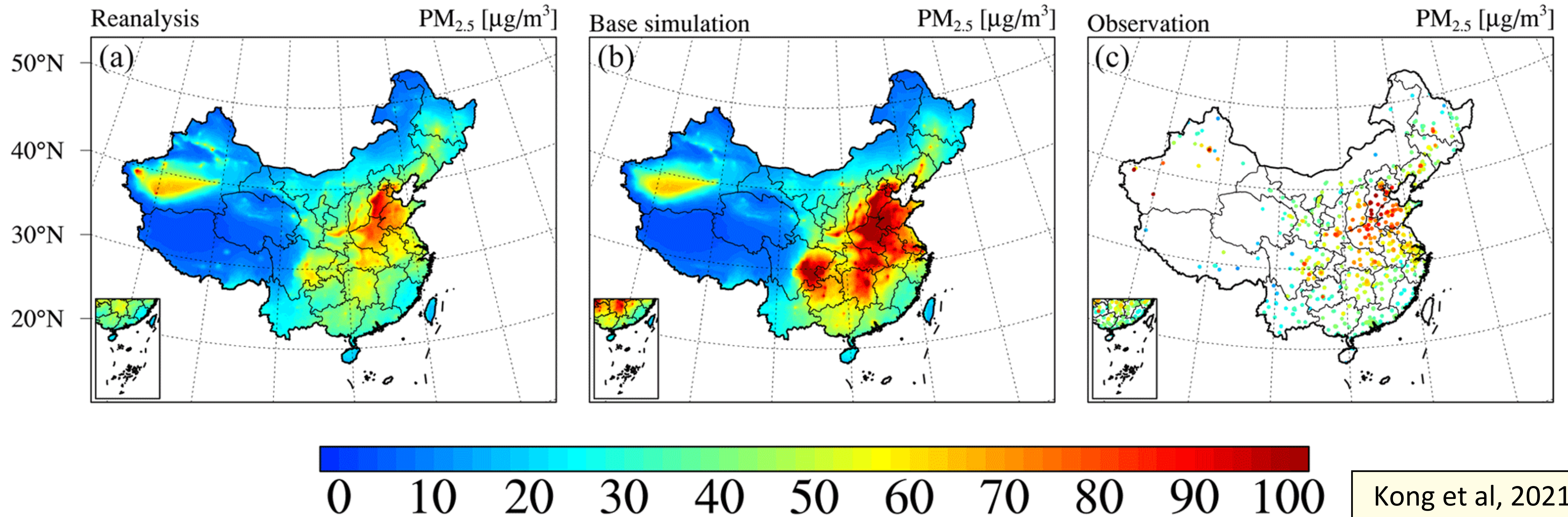
*Multi-species validation over South Korea during KORUS-AQ campaign*

Essential to improve precursors species to reproduce ozone



# Regional chemical reanalysis

*A 6-year high-resolution (15x15 km) Chinese air quality reanalysis (CAQRA) combining surface observations (PM<sub>2.5</sub>, PM<sub>10</sub>, SO<sub>2</sub>, NO<sub>2</sub>, CO, O<sub>3</sub>)*

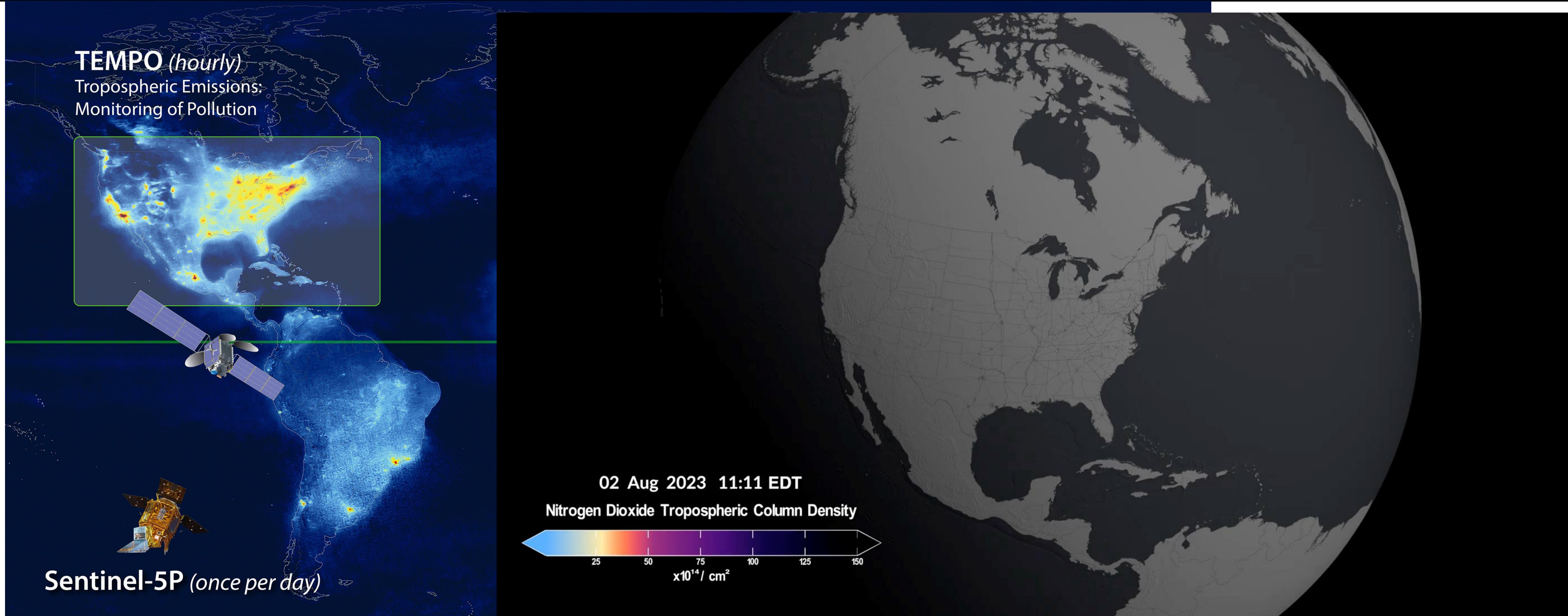


**Regional high-resolution model + surface obs → local air quality**

Challenges: representativeness, data quality, model resolution, combination with satellite data



# Towards an Air Quality Constellation



## How does the constellation improve knowledge of global air quality?

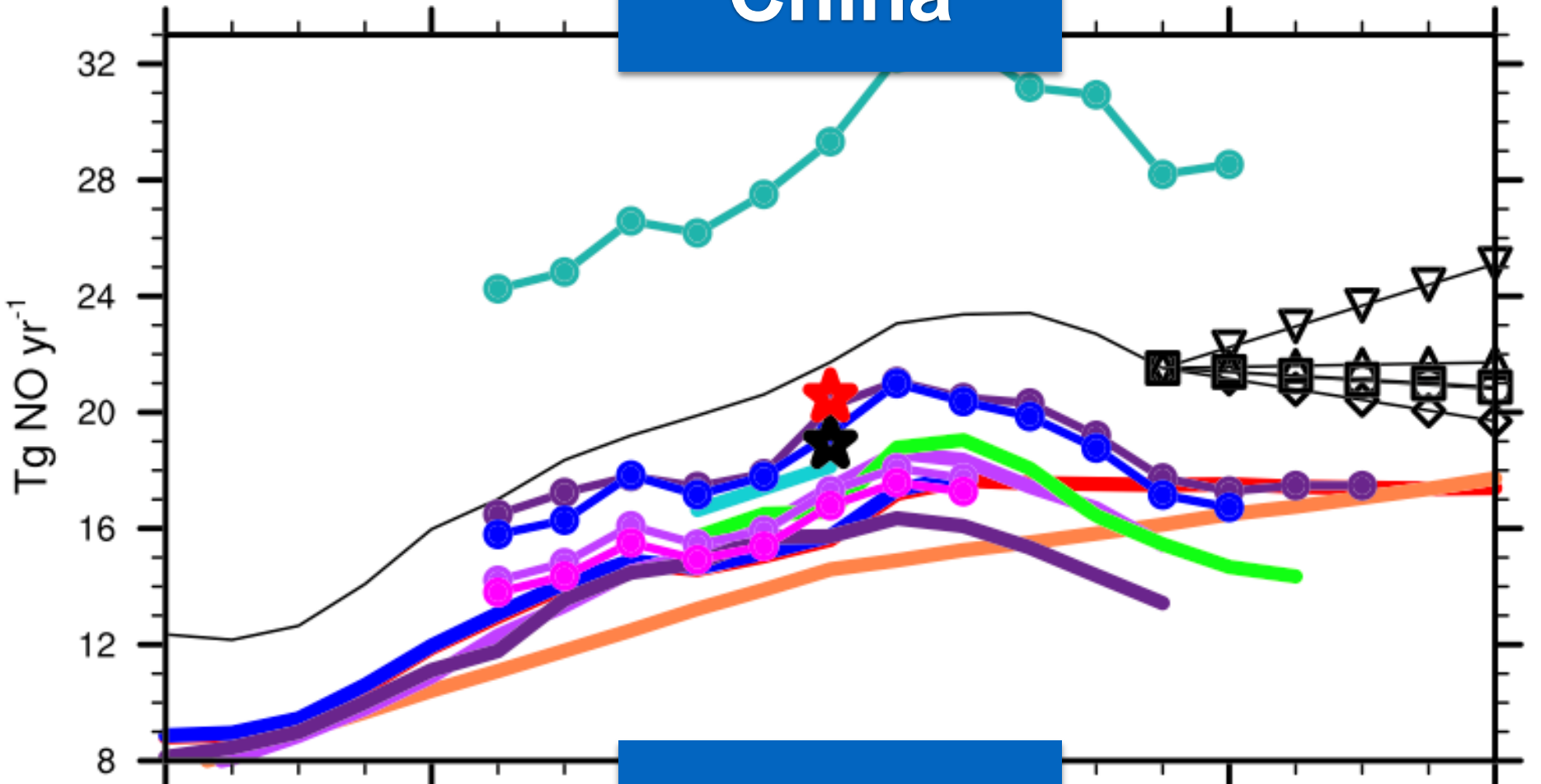
- GEO sounders will provide an unprecedented number of composition observations at high spatial resolution.
- LEO sounders (IASI, CrIS, S5p) provide the global picture and thread the GEO observations together.

We face new challenges in integrating these different types of observations

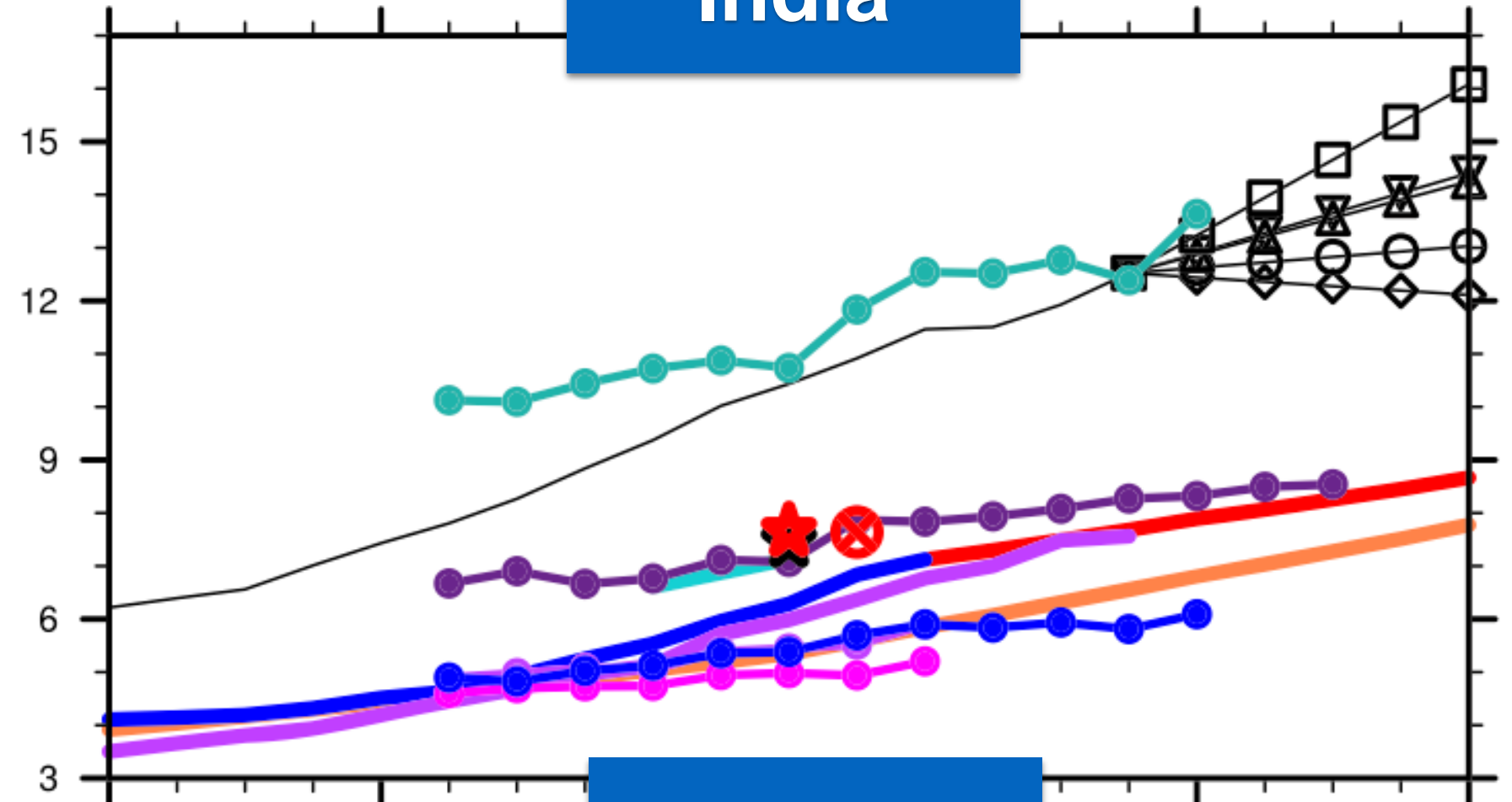


# Surface emissions in chemical reanalysis

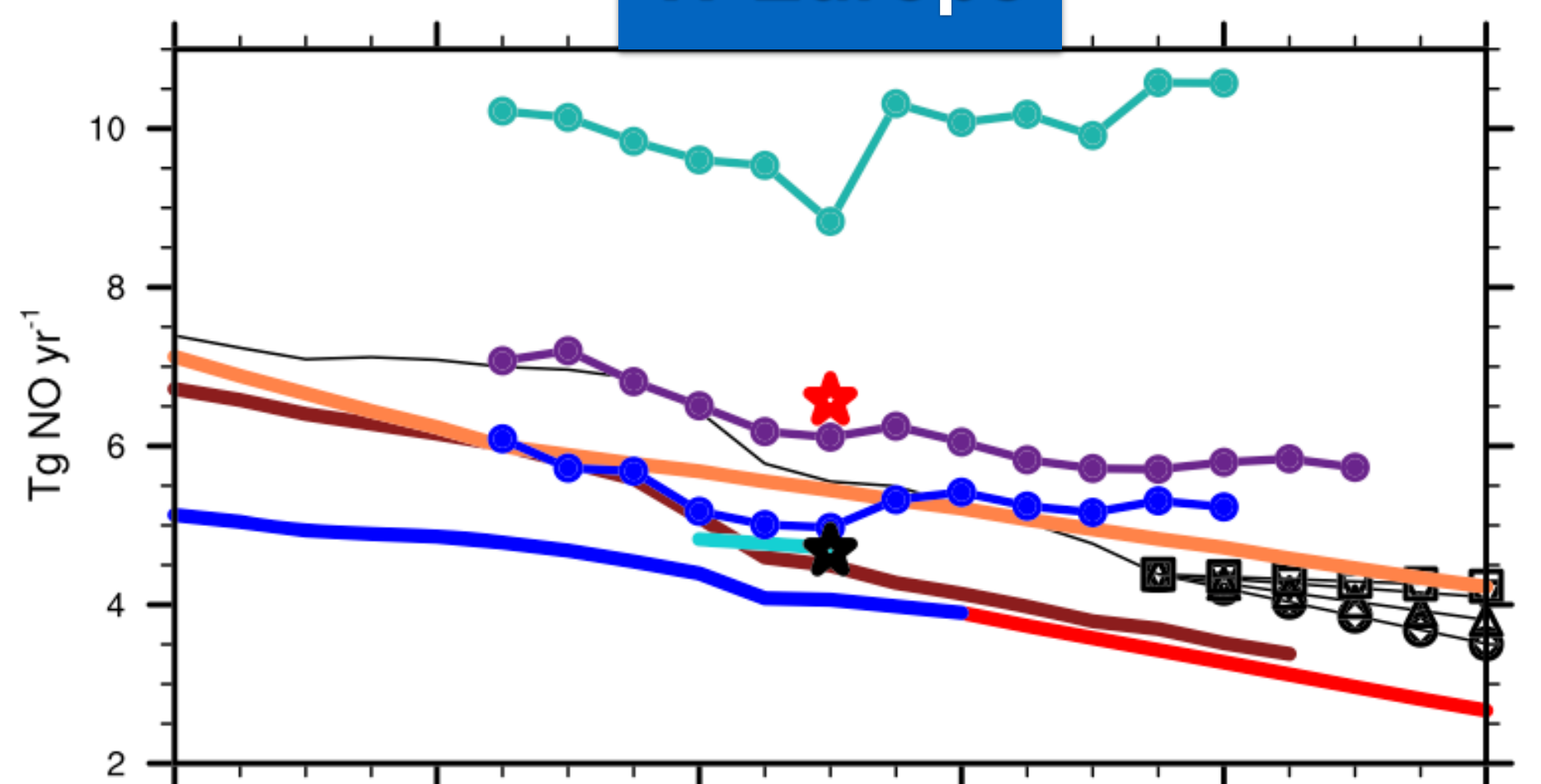
### China



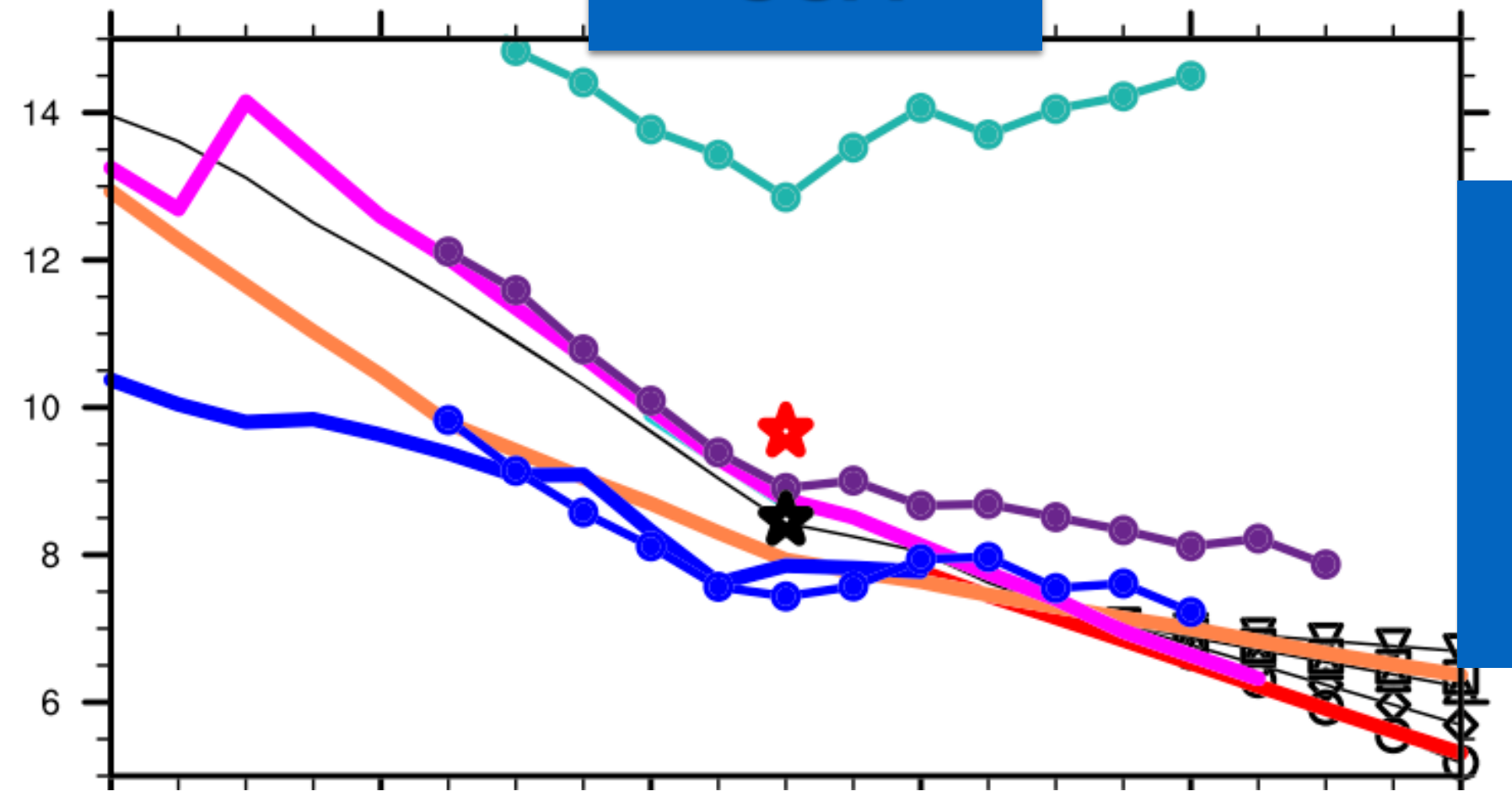
### India



### W Europe



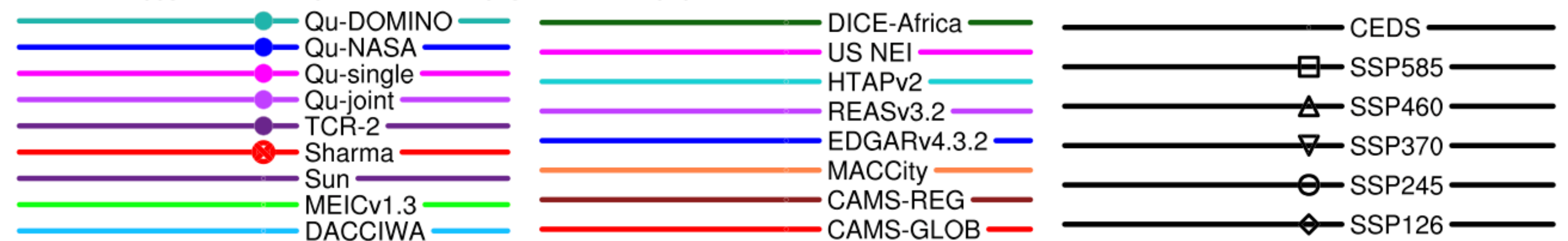
### USA



Emissions estimation from chemical reanalysis

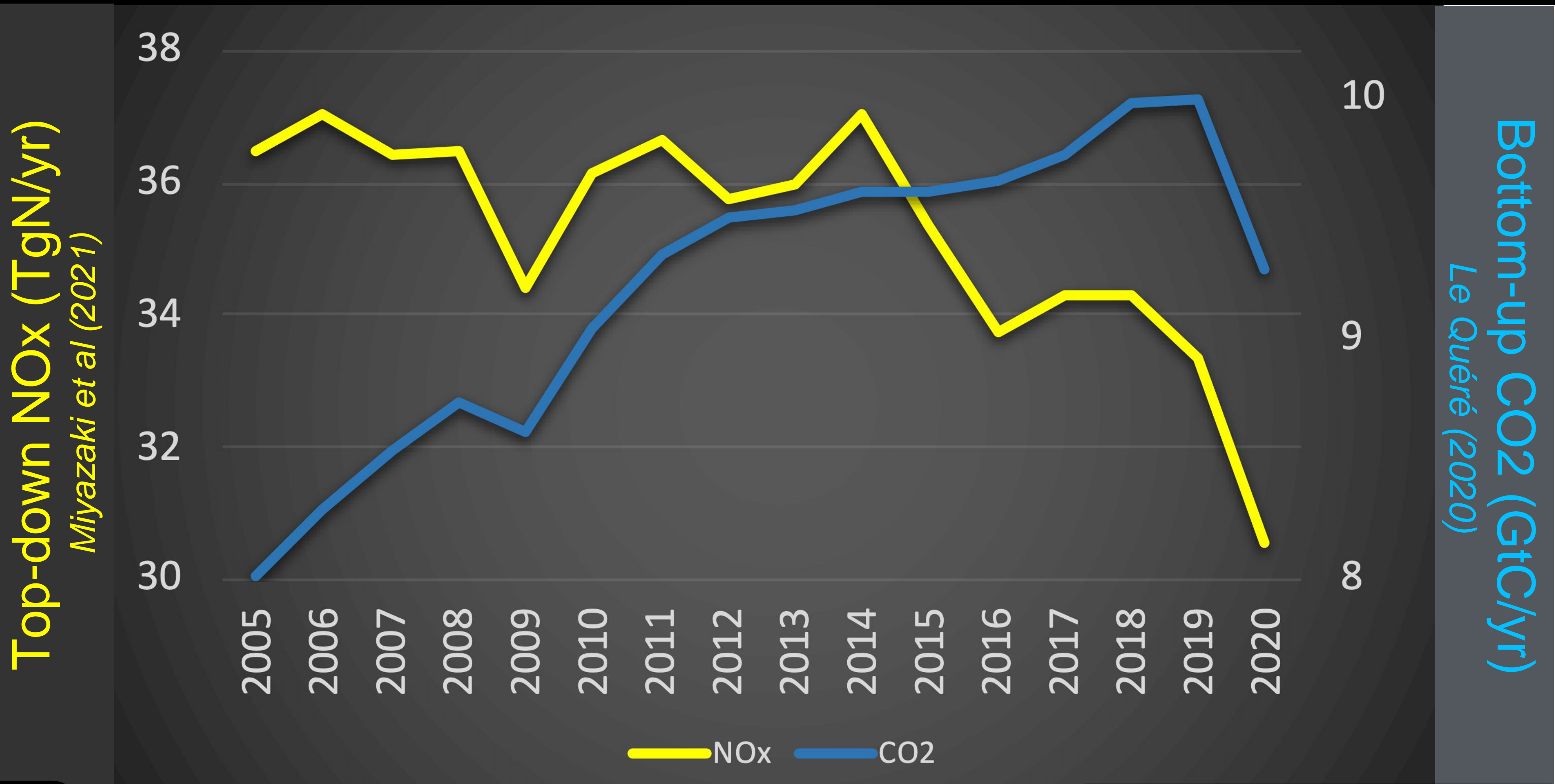


- Emission scenario evaluation
- Attribution study
- Environmental policy





# Global anthropogenic emission reductions in 2020: 7% (CO<sub>2</sub>) 8% (NO<sub>x</sub>)



1. Emissions (NO<sub>x</sub>, SO<sub>2</sub>, CO)

*Jiang et al. 2020 ACP*

2. Concentrations

*Miyazaki et al. 2020 GRL*

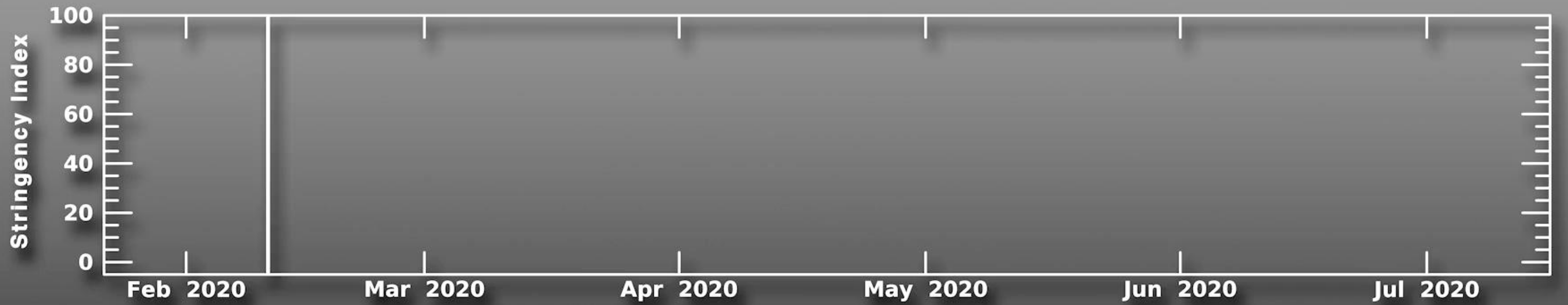
*Miyazaki et al. 2021 Science Adv.*

3. Health and climate Impacts

*Laughner et al. 2021 PNAS*

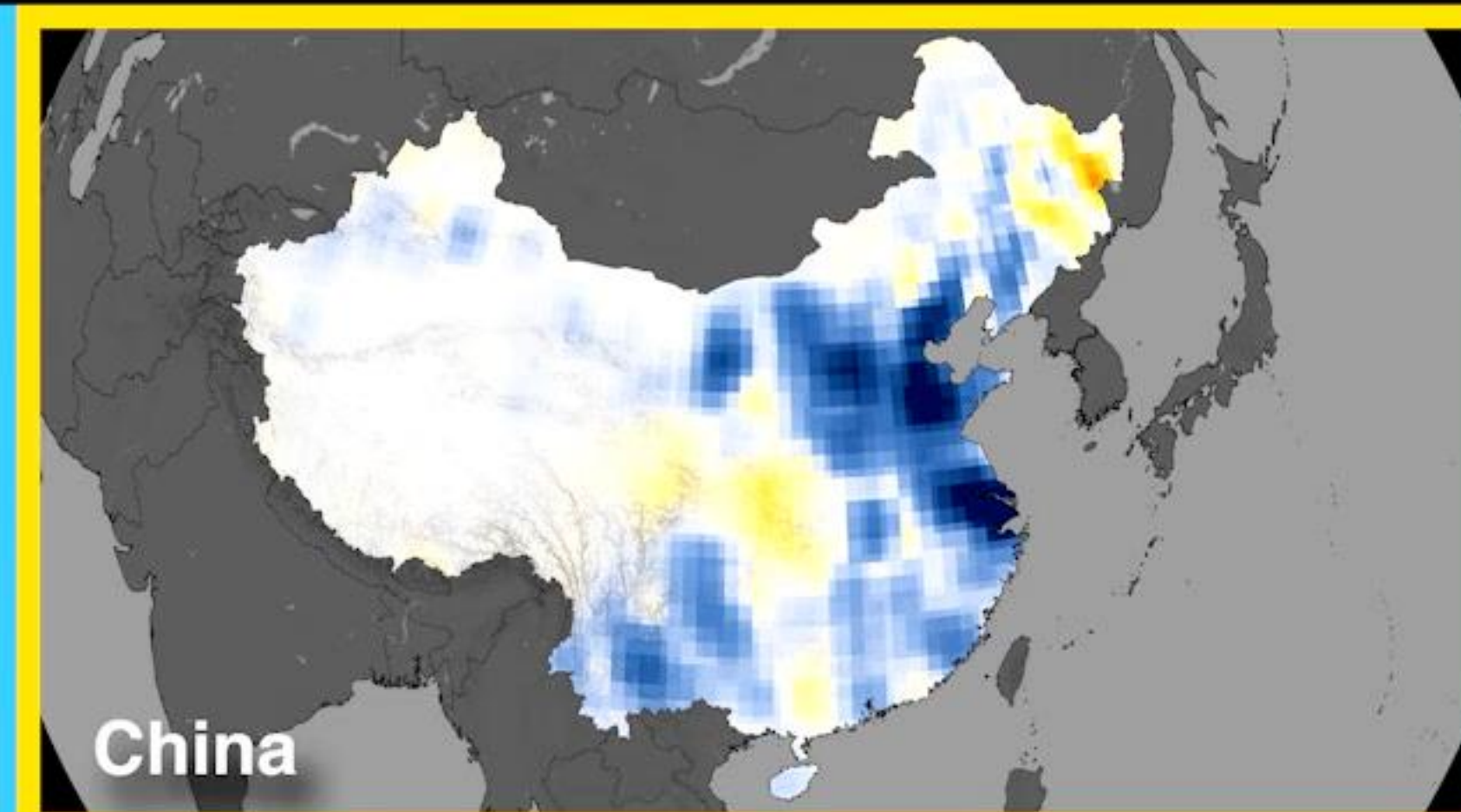
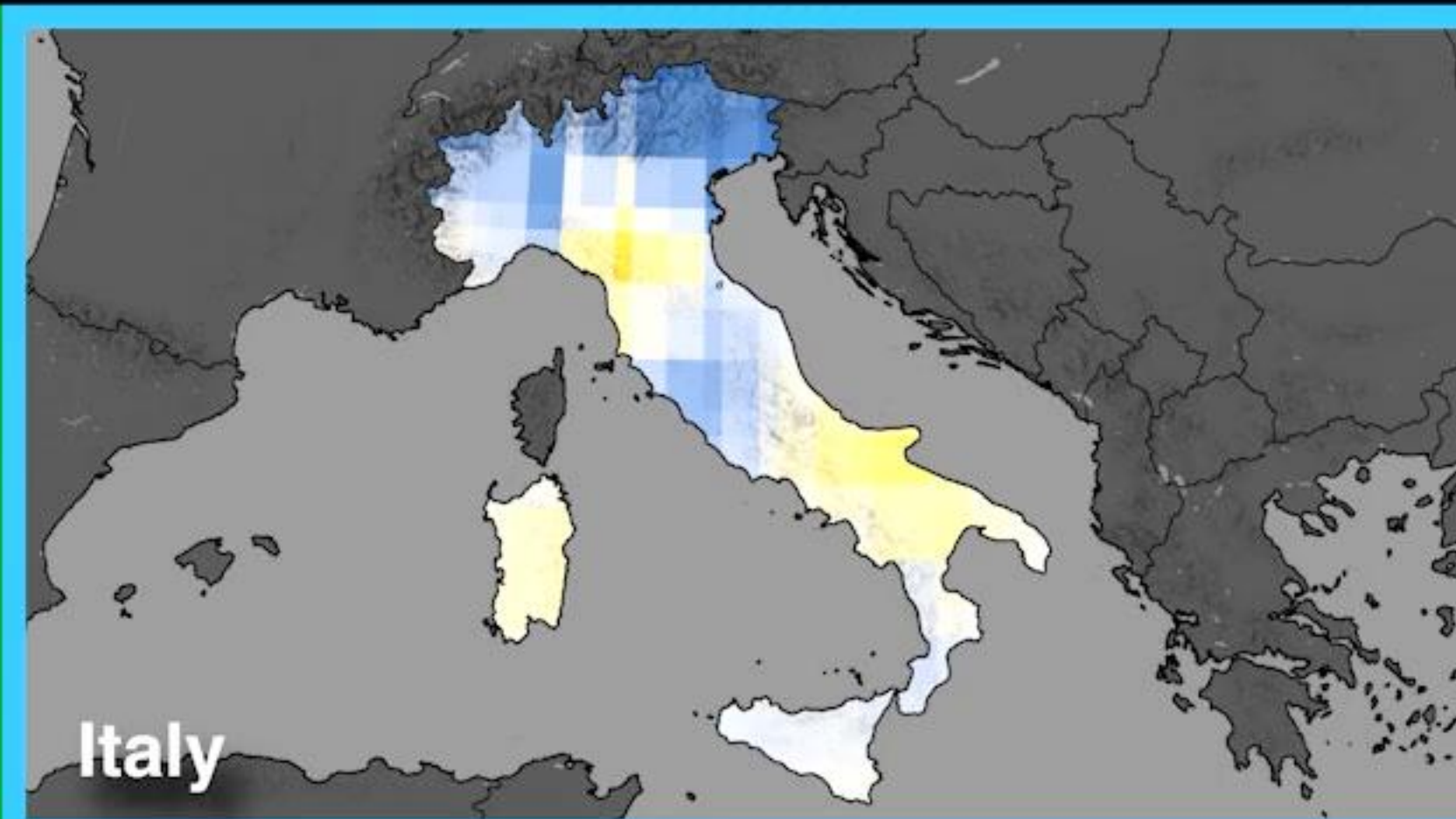
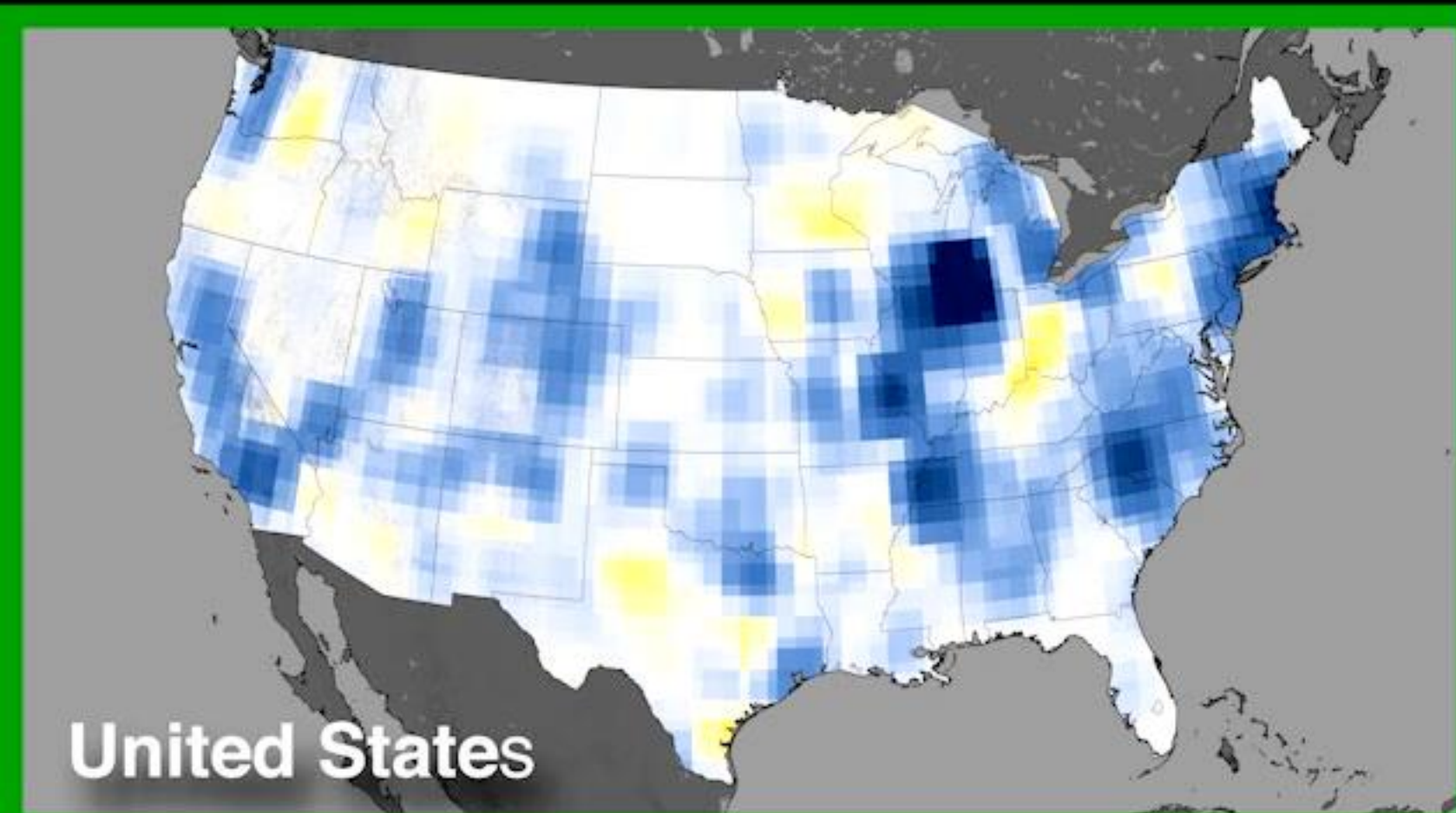
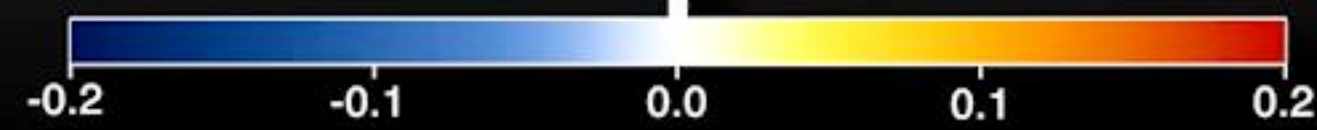
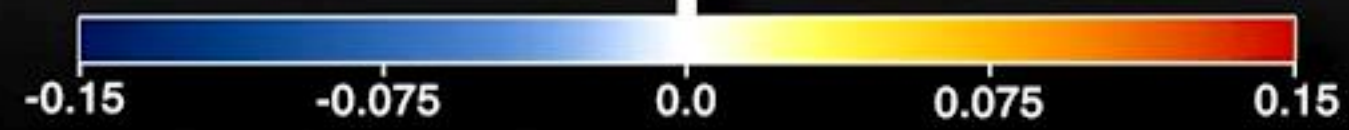
*Sekiya et al. 2023 Science Adv.*





# Feb 10 2020

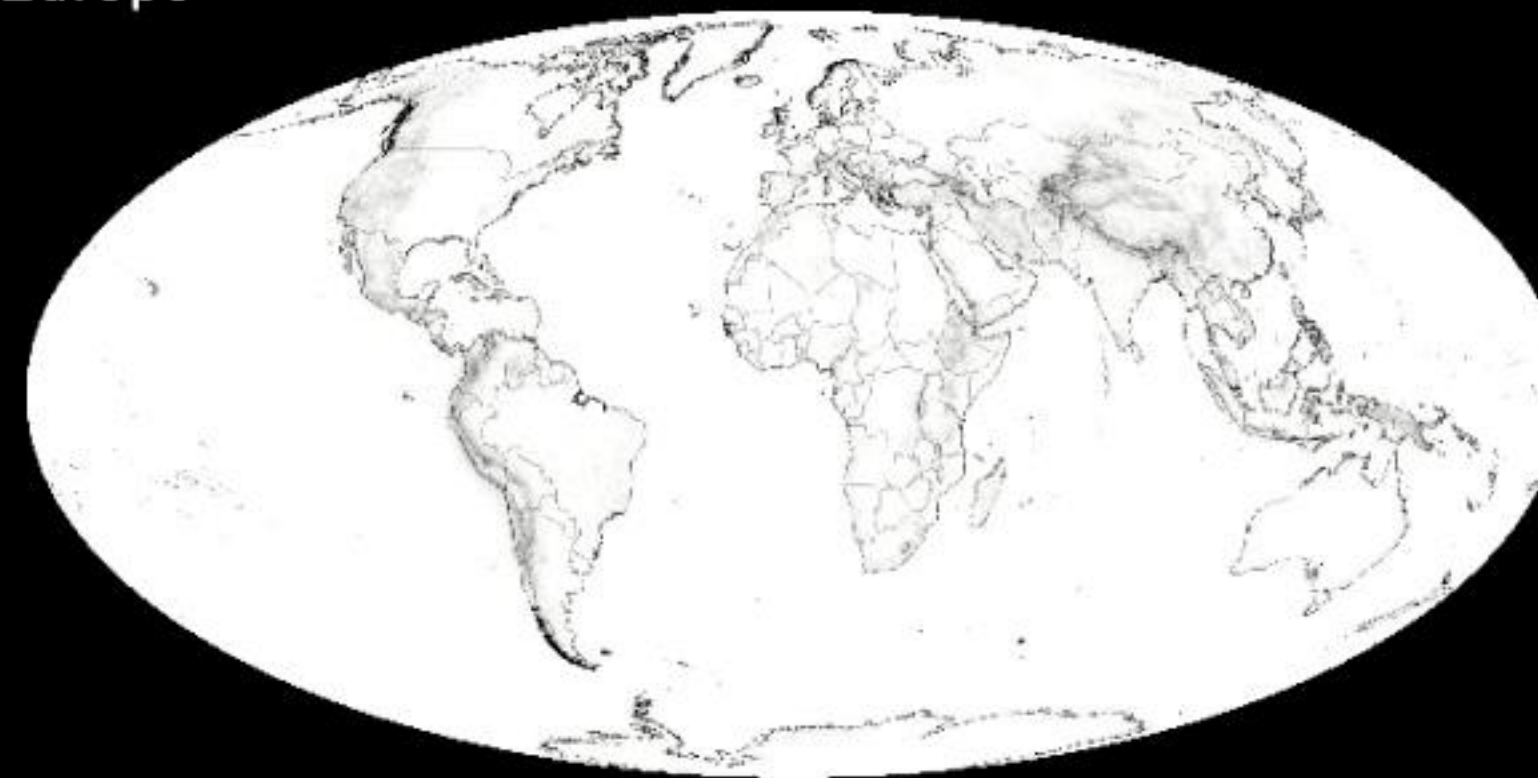
## NO<sub>x</sub> Anomaly, kgN/m<sup>2</sup>s



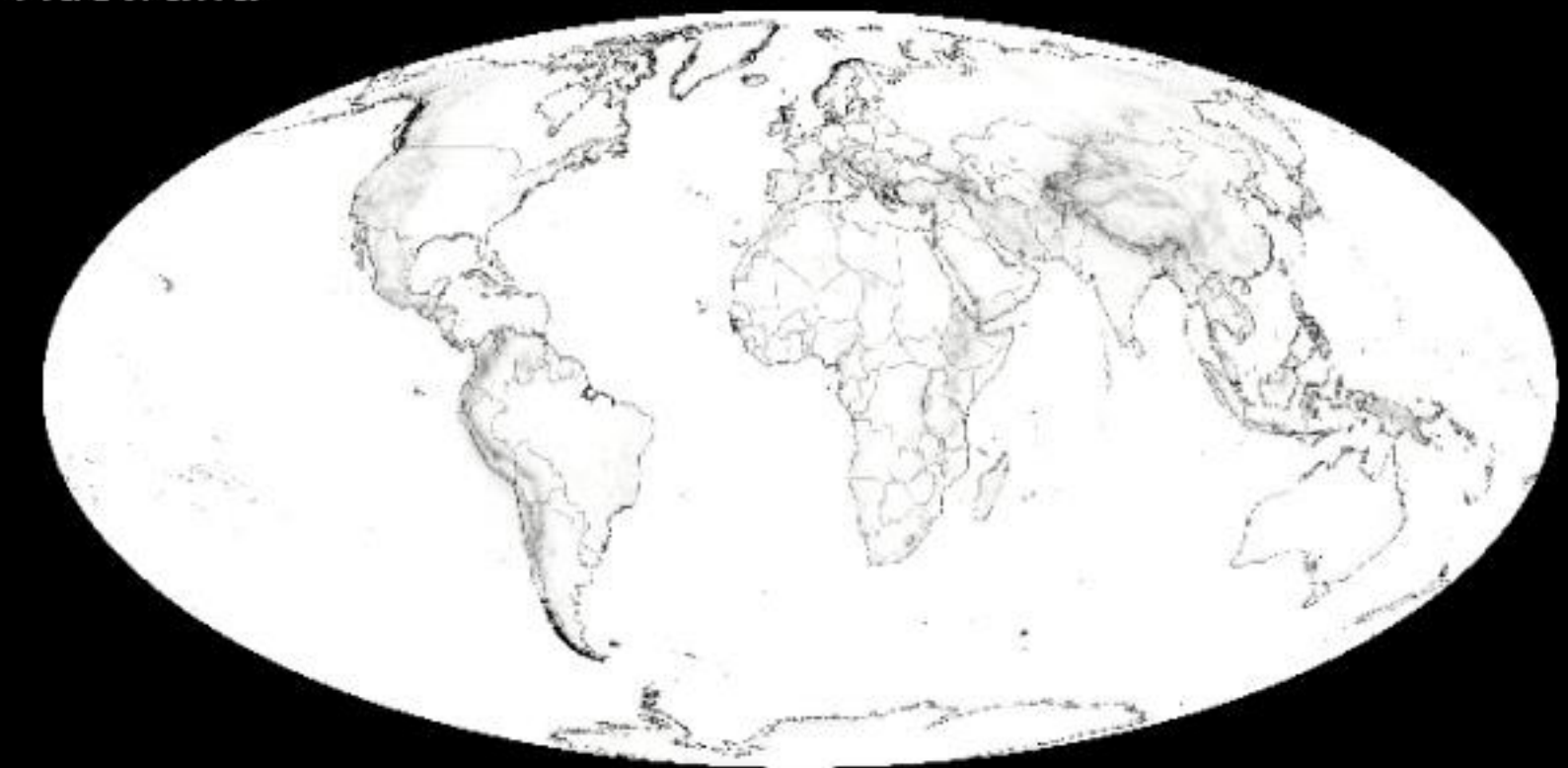
Africa



Europe



Australia



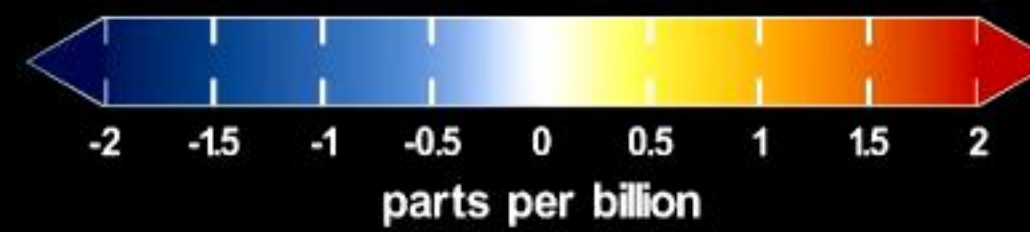
Middle East, W Asia



Non-China Asia



Feb 01 2020  
Ozone Anomaly



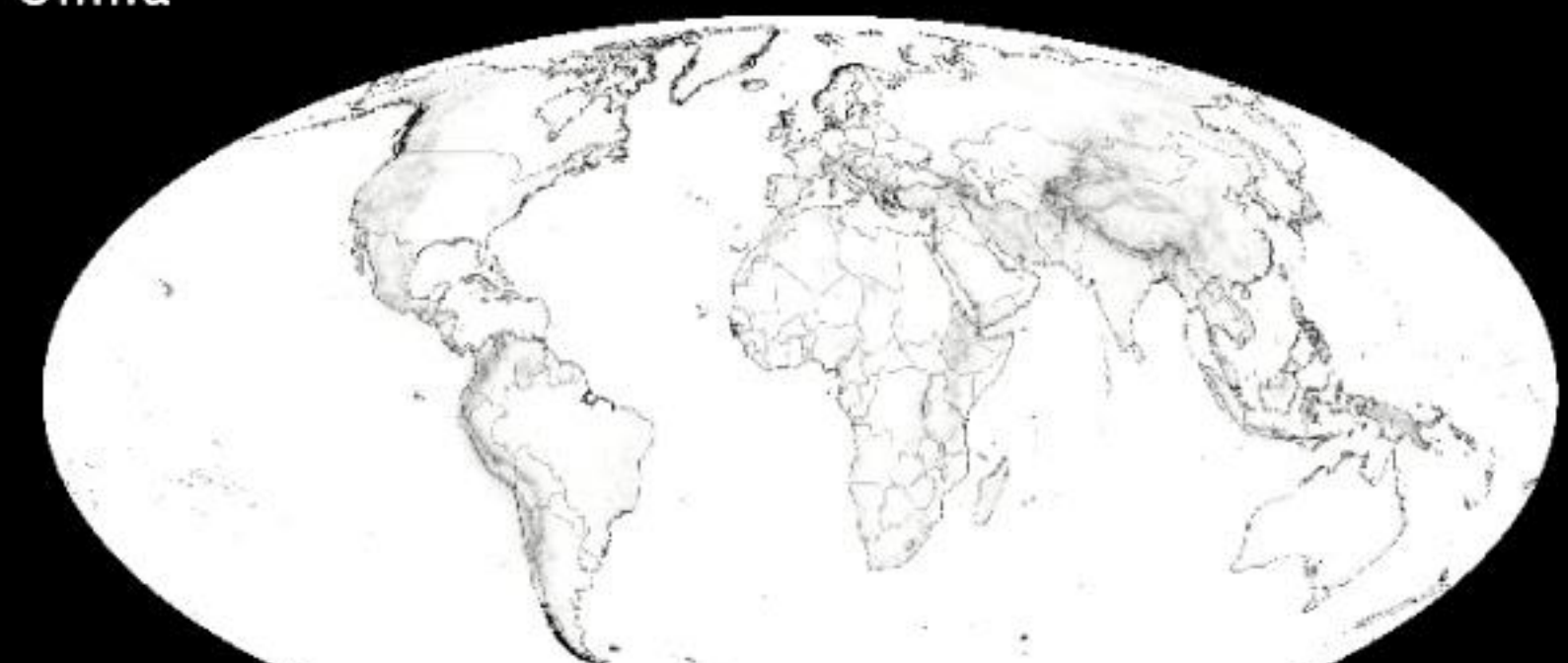
S America



United States



China

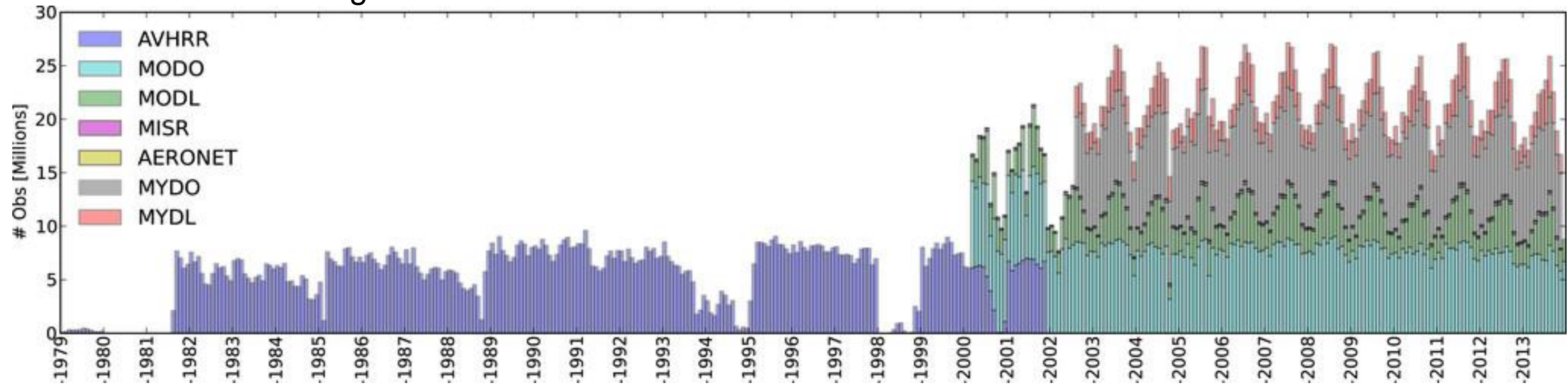


→ Better understand the efficacy of policies that co-benefit air quality and climate

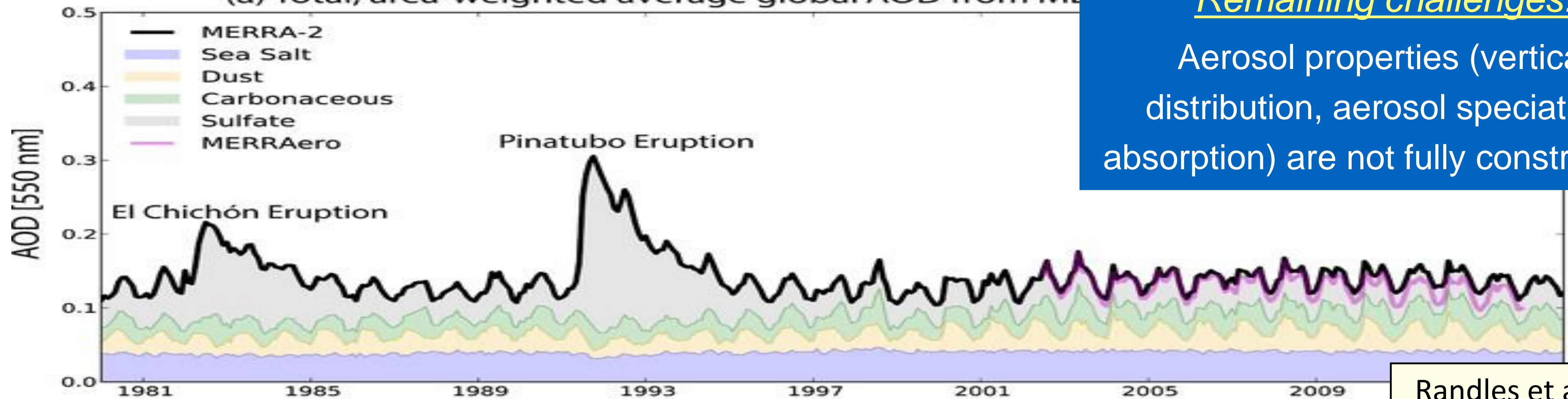


# MERRA-2 aerosol reanalysis

Total global number of observations from various AOD and aerosol observations



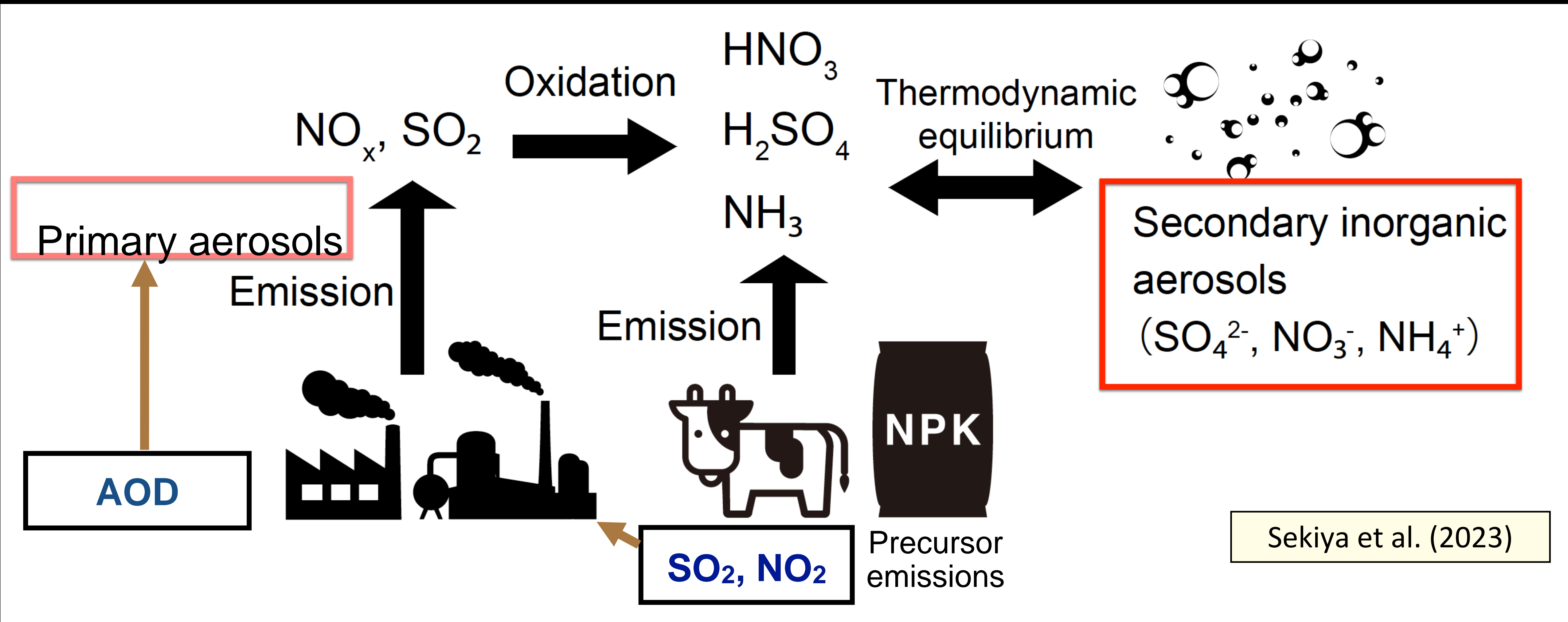
(a) Total, area-weighted average global AOD from MERRA-2



Remaining challenges:  
Aerosol properties (vertical distribution, aerosol speciation, absorption) are not fully constrained.



# Sulfate, Nitrate, and Ammonium (SNA) aerosols

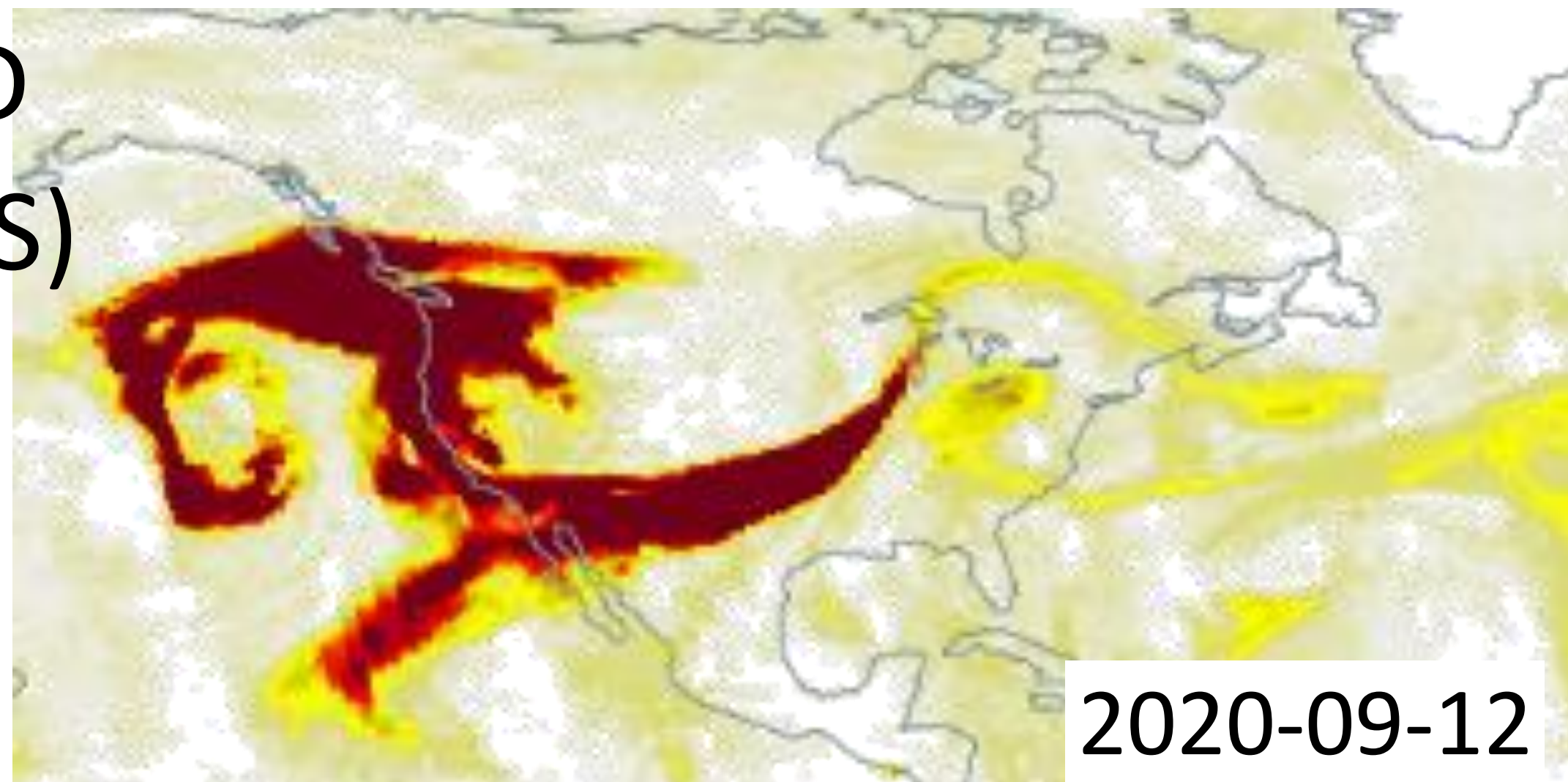


- Strong (10-20%) decreases in secondary inorganic aerosols due to COVID  $\rightarrow + 0.14\text{W/m}^2$
- The obtained responses in emissions, aerosols, and climate forcing highlight the importance of aerosol & trace gas reanalysis in the climate impact assessment and Earth system reanalysis

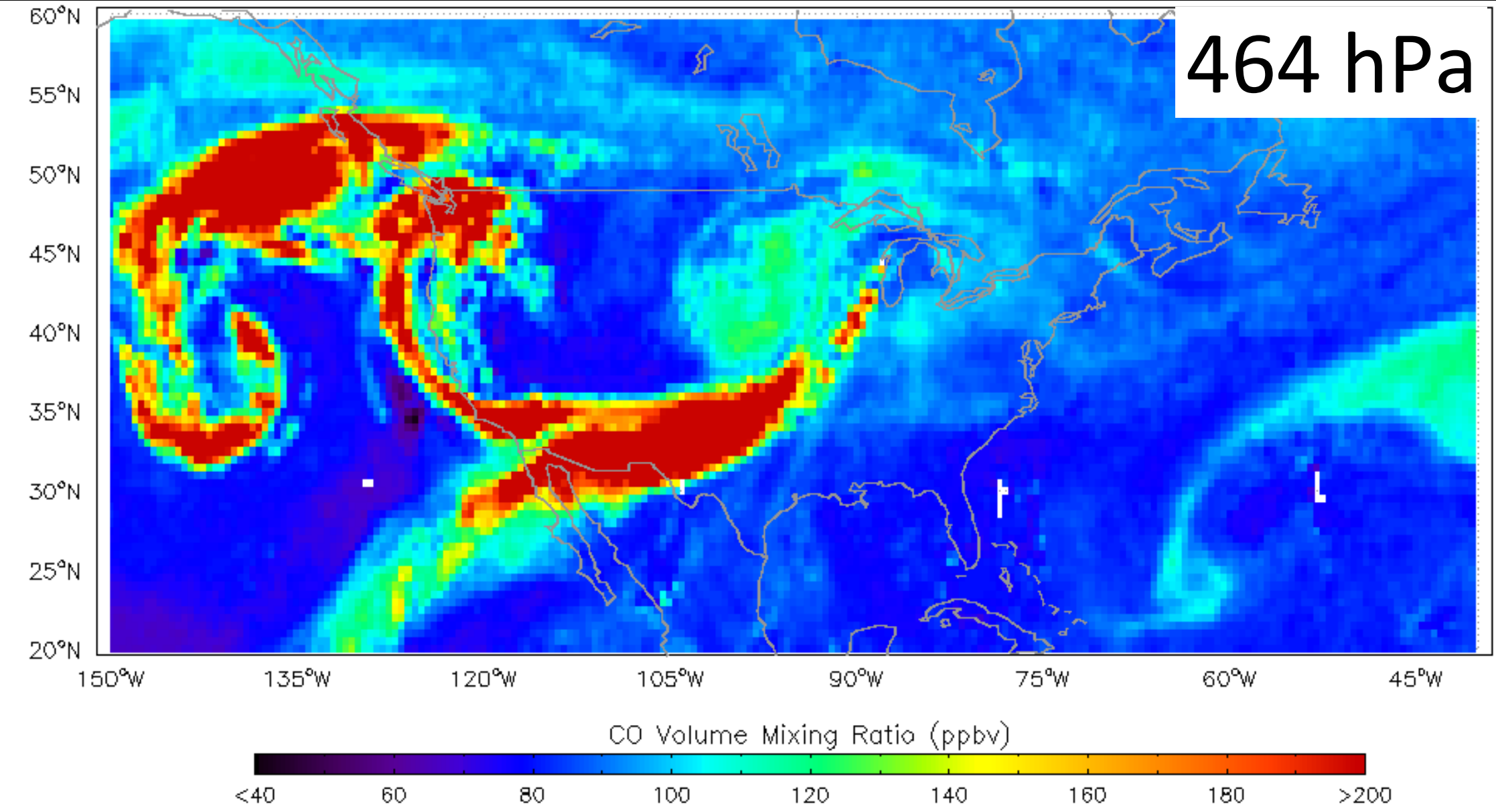


# CrIS composition data: 2020 California wildfires

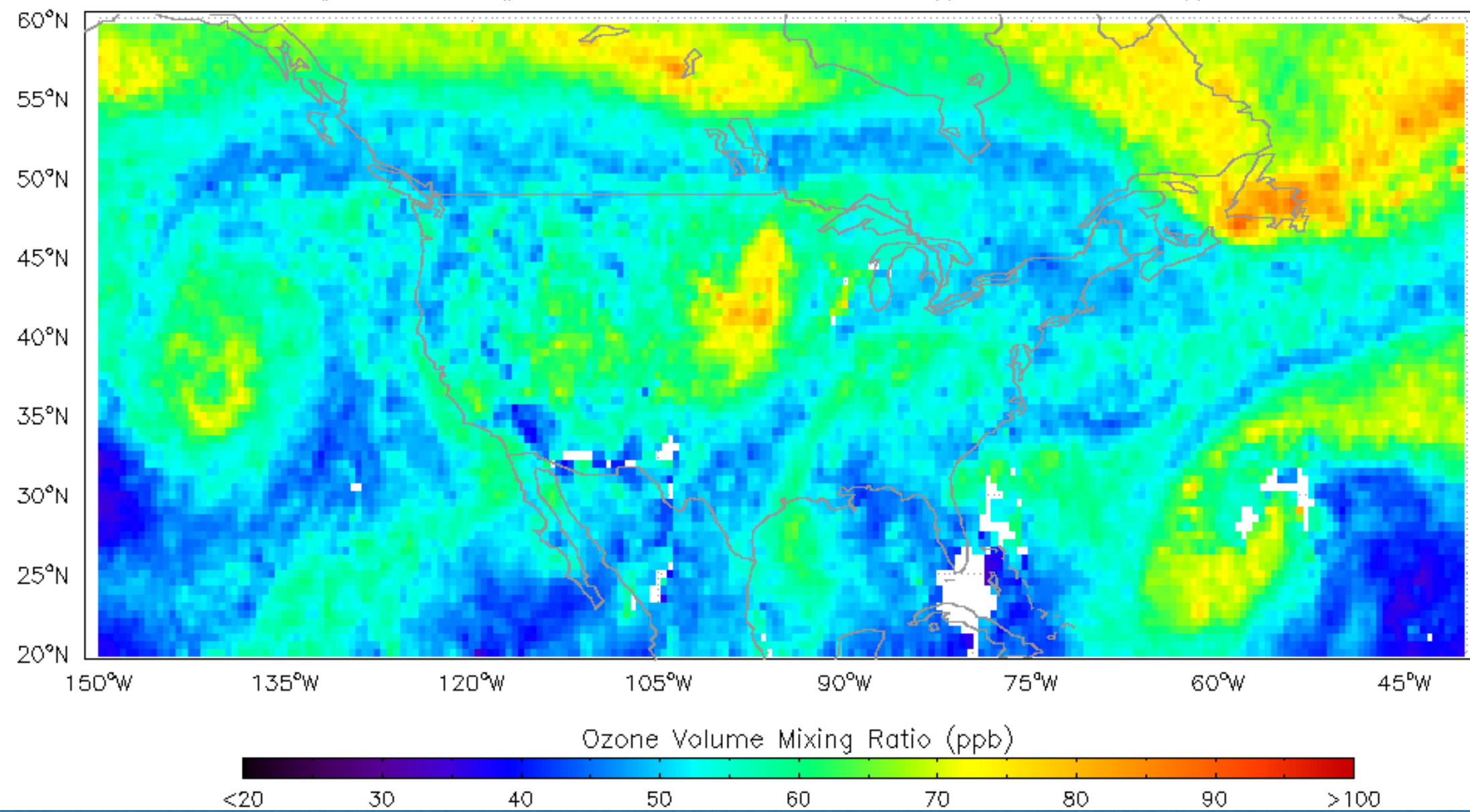
AOD  
(VIIRS)



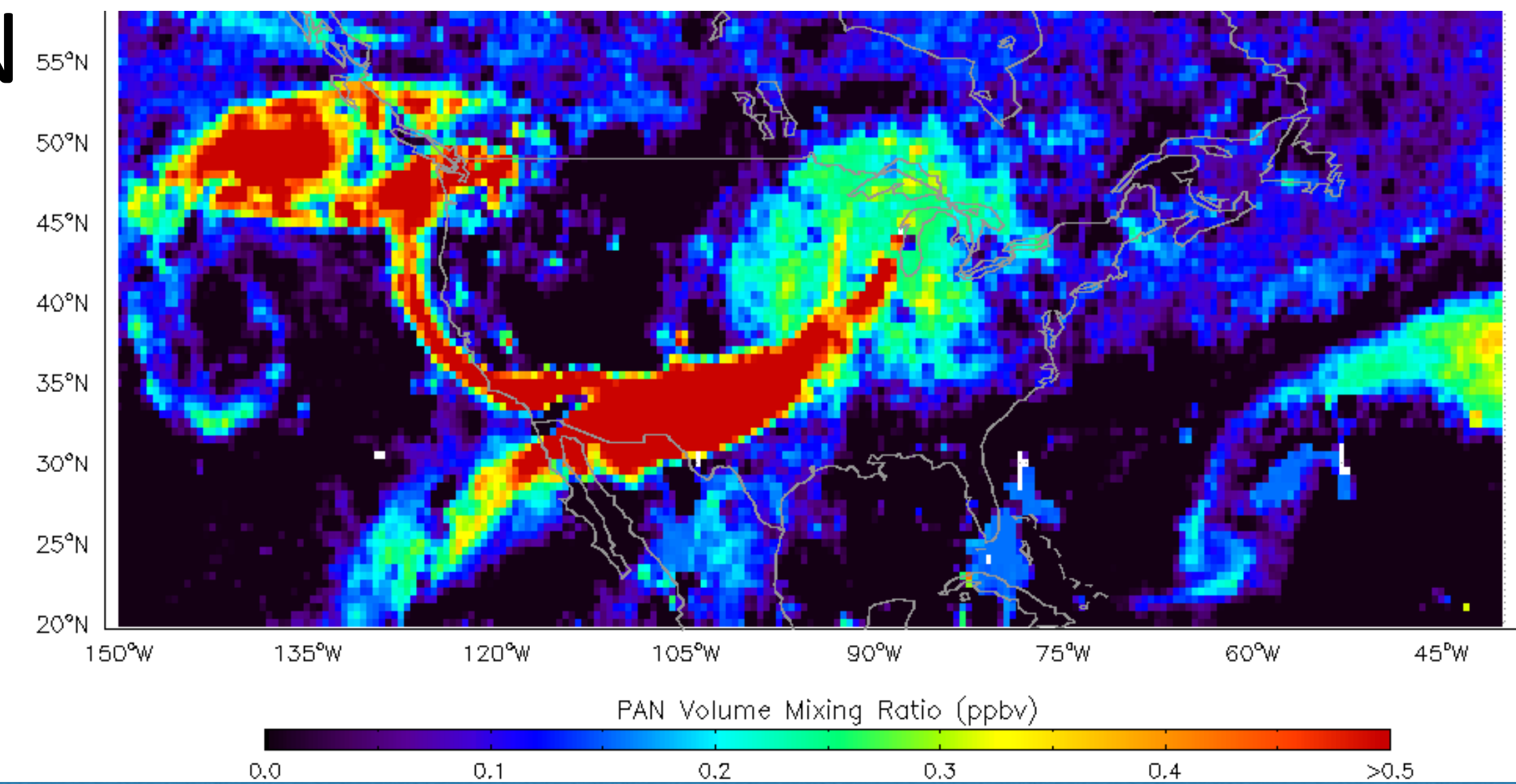
CO



O<sub>3</sub>



PAN



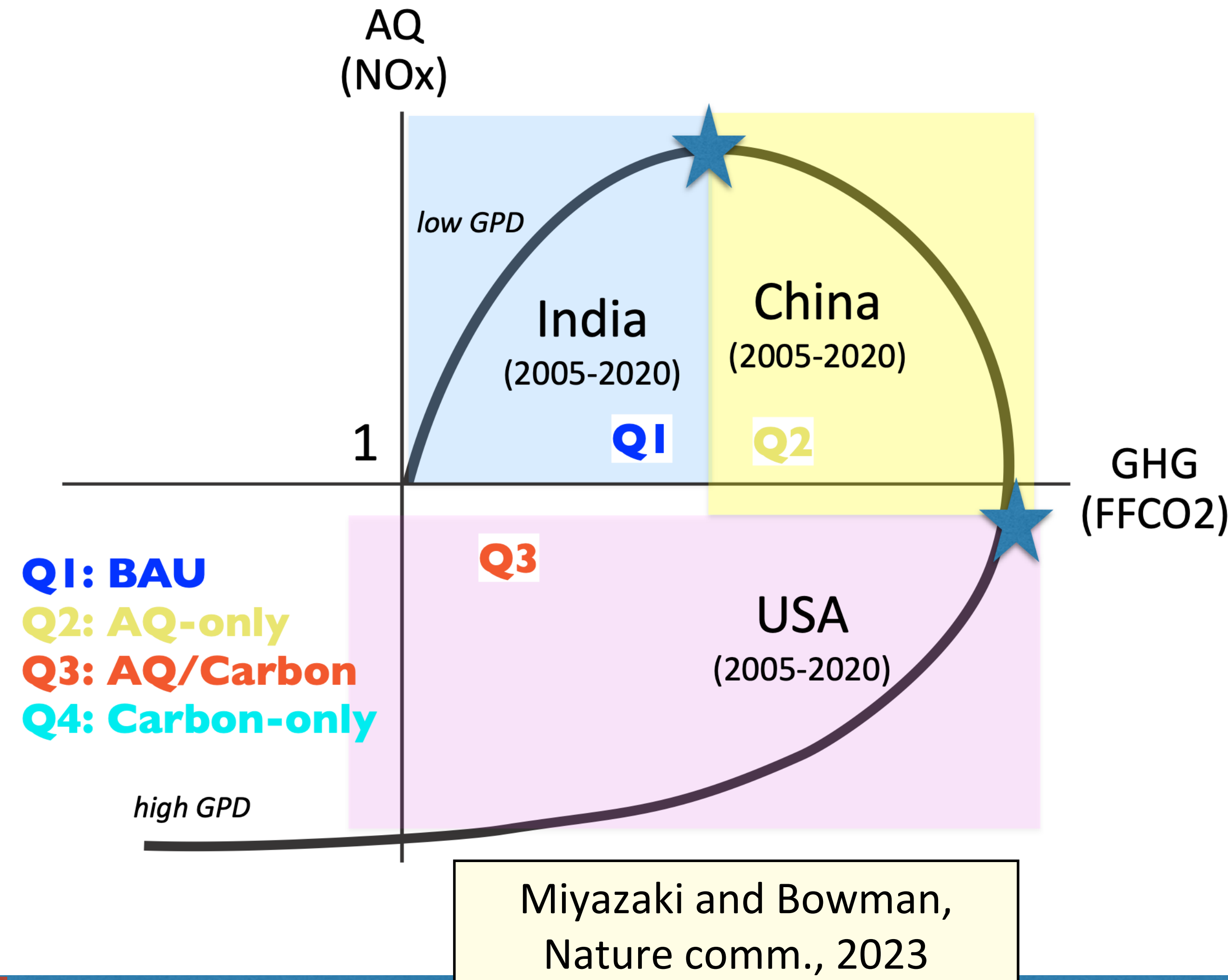
Assimilating CrIS data (+NH<sub>3</sub>) will comprehend our understanding of source attributions



# Estimation of fossil fuel CO<sub>2</sub> from chemical reanalysis emissions

## From chemical reanalysis to carbon cycle and climate

- Quantifying the coevolution of GHG and AQ pollutants, associated with increased regulation and economic development, can provide insight into underlying anthropogenic processes.
- We classify the dynamics of historic emissions in terms of a modified Environmental Kuznets Curve (MEKC).
- The predictive skill of FFCO<sub>2</sub> less than 2% error at one-year lags and < 10% for 4-year lags.



GHG  
Fossil fuel CO<sub>2</sub> (FFCO<sub>2</sub>)



Air pollutants



# Summary

- The chemical reanalysis data, combined with suborbital and ground-based measurements, has been used to improve our understanding of atmospheric composition and to evaluate new satellite data products.
- New LEO and GEO measurements and multi-spectral retrievals of composition provide much-improved spatial and temporal resolution and coverage in conjunction with the chemical reanalysis. They should lead to greater usefulness of satellite measurements for climate and air quality applications.
- Combining various Earth observations while accounting for interactions between trace gases, aerosols, and GHG is essential to understanding anthropogenic and natural influences on climate and for Earth system reanalysis.